

A satellite image of a hurricane, showing a well-defined eye and spiral cloud bands, viewed from space. The image is positioned on the left side of the slide, with the hurricane's eye clearly visible in the upper left quadrant.

Hurricane Predictions and Projections

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Summary

- Premature to conclude we have seen hurricane change due to CO₂
- Models allow estimates of future activity:
 - Next couple of decades: internal variability dominant player
(some may be predictable, some not)
 - NA Hurr. Response to CO₂: maybe fewer, probably stronger.
 - Aerosol forcing and response a key to next few decades.
- Encouraging results from long-lead (multi-season and multi-year) experimental forecasts using hybrid system:

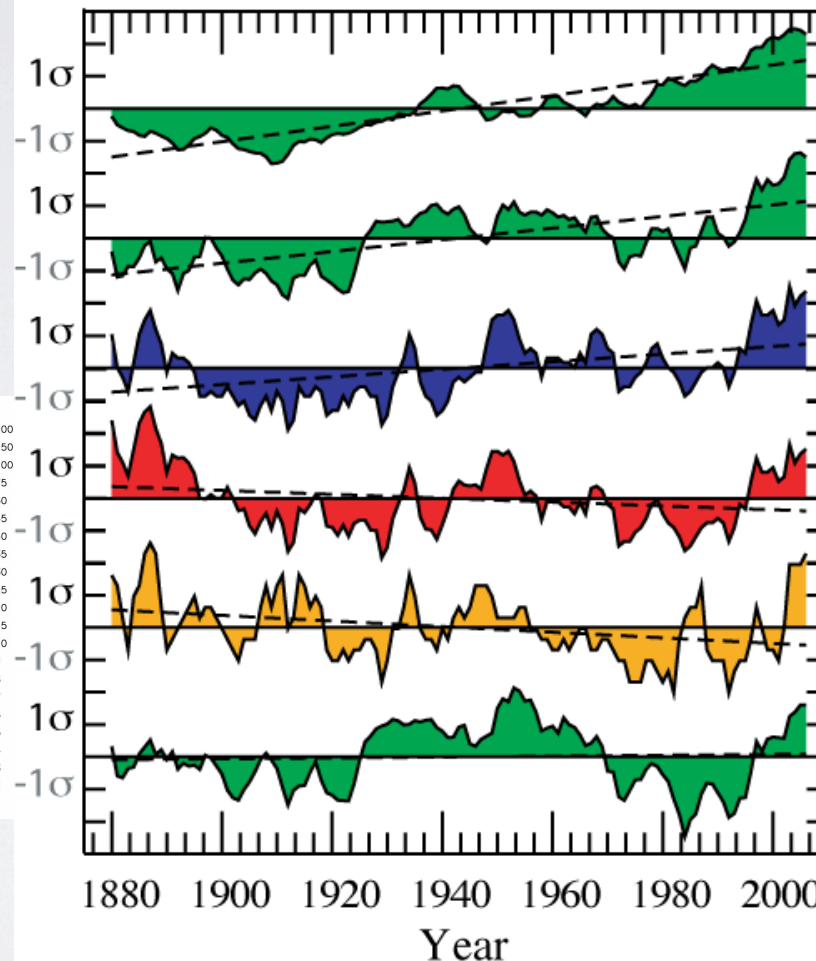
*“past performance no guarantee of future returns”
but good past performance nice start...*
- High-resolution coupled and atmospheric models enable the next generation of hurricane prediction and projection.

Outline

- Historical hurricane records
- Projecting decadal to centennial hurricane activity
- Predicting seasonal hurricane activity
- Predicting multi-year hurricane activity

Historical Hurricane Records

Normalized Tropical Atlantic Indices



Global Mean Temperature

Tropical Atlantic SST

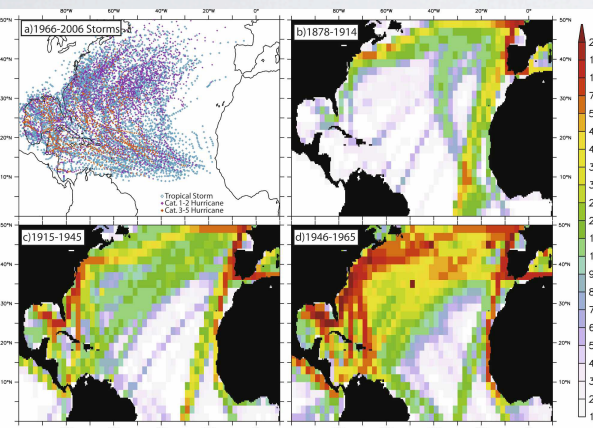
Raw Hurricane Counts

Adjusted Hurricane Counts

U.S. Landfalling Hurricanes

Atlantic SST Relative to Tropical SST

Adjustments to storm counts
based on ship/storm track
locations and density



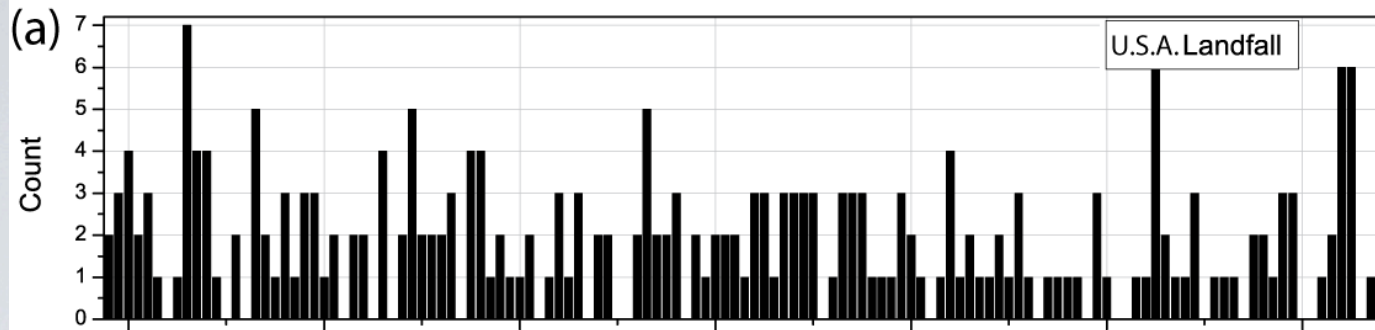
Vecchi and Knutson (2008, *J. Clim.*)

Landsea et al. (2009, *J. Clim.*)

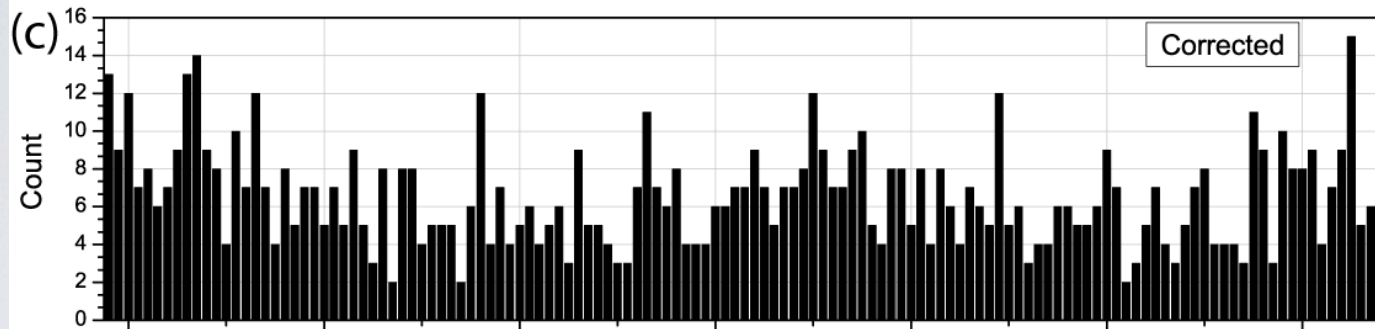
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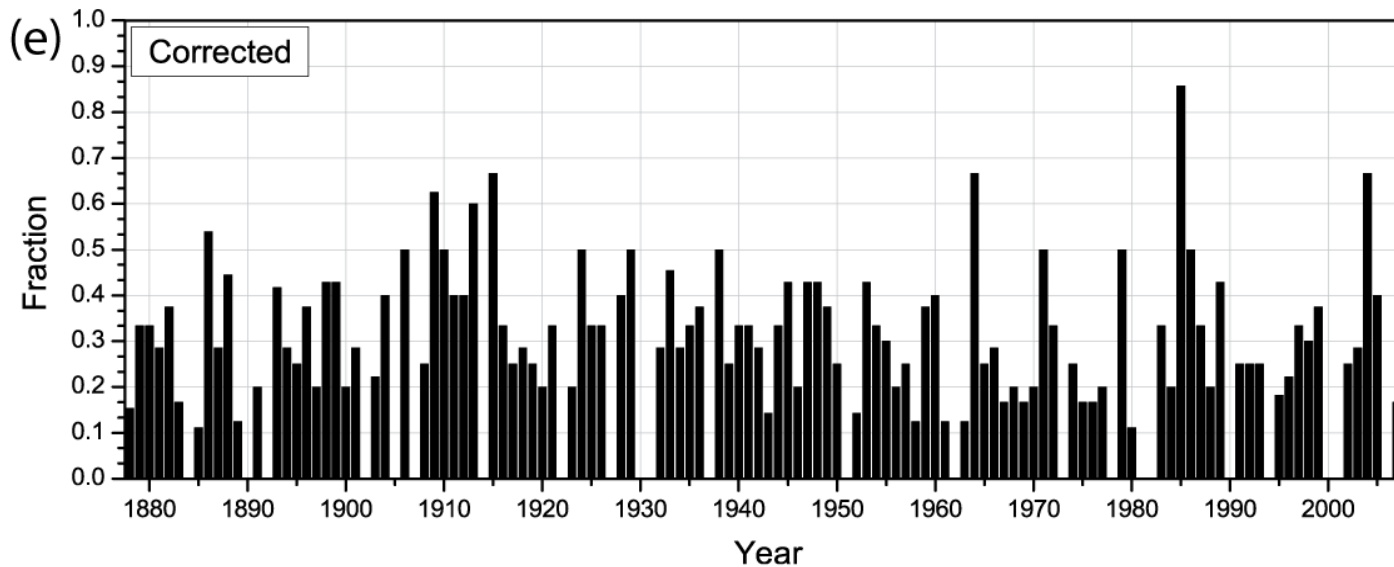
Seasonal hurricane counts



U.S. Landfalling
Hurricanes



Basinwide
Hurricanes



Fraction of
Basinwide
Hurricanes
Making U.S.
Landfall

Sources of & Limitations on climate predictability

hours to a year

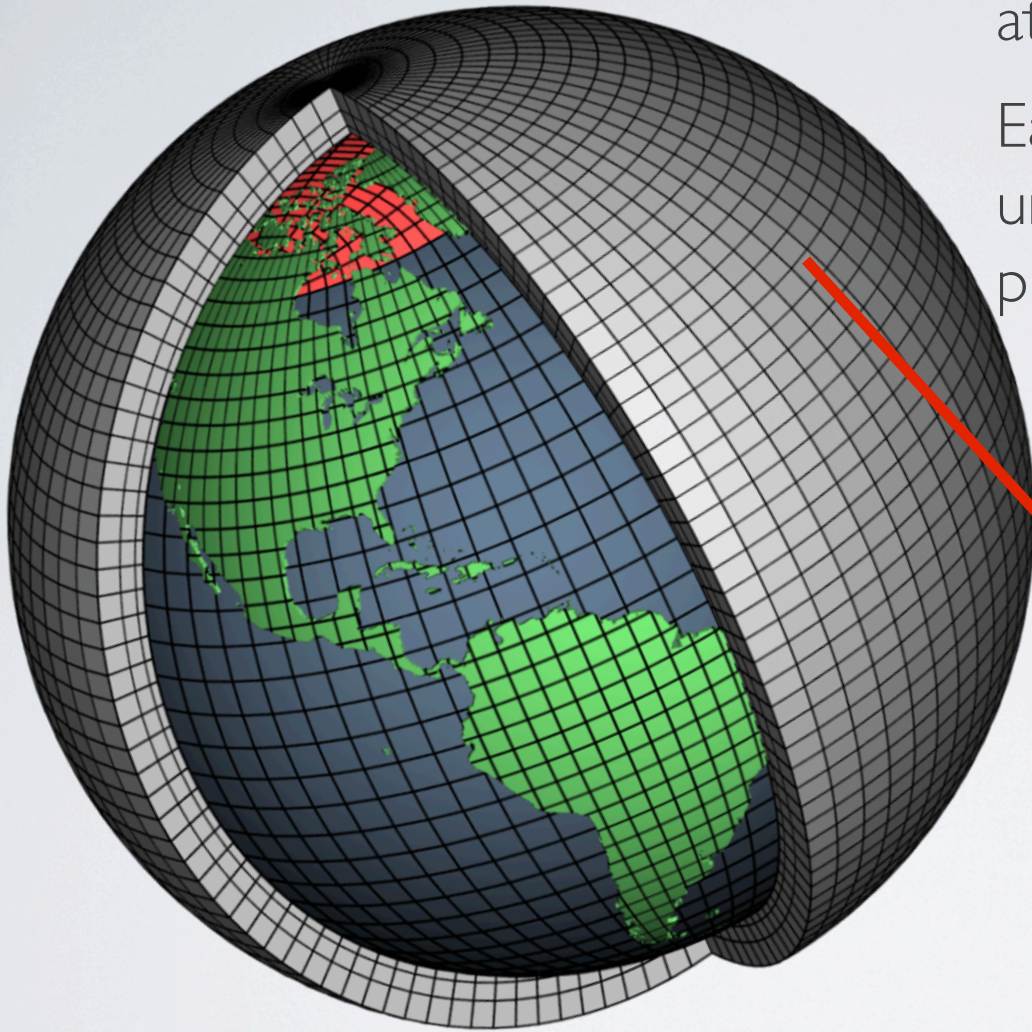
Climatology
(what happens typically, including randomness)
need good observations
Evolution of initial conditions
(e.g., weather or El Niño forecast)
need good observations, models, initialization schemes

Many decades
to centuries

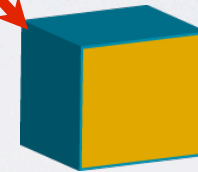
Climatology
Climate response to forcing
(e.g., CO₂, aerosols, sun, volcanoes)
need good models and estimates of forcing

Models have land, ocean, atmosphere and ice components.

Each encapsulates our best understanding of underlying processes controlling its evolution.



In each grid cell:



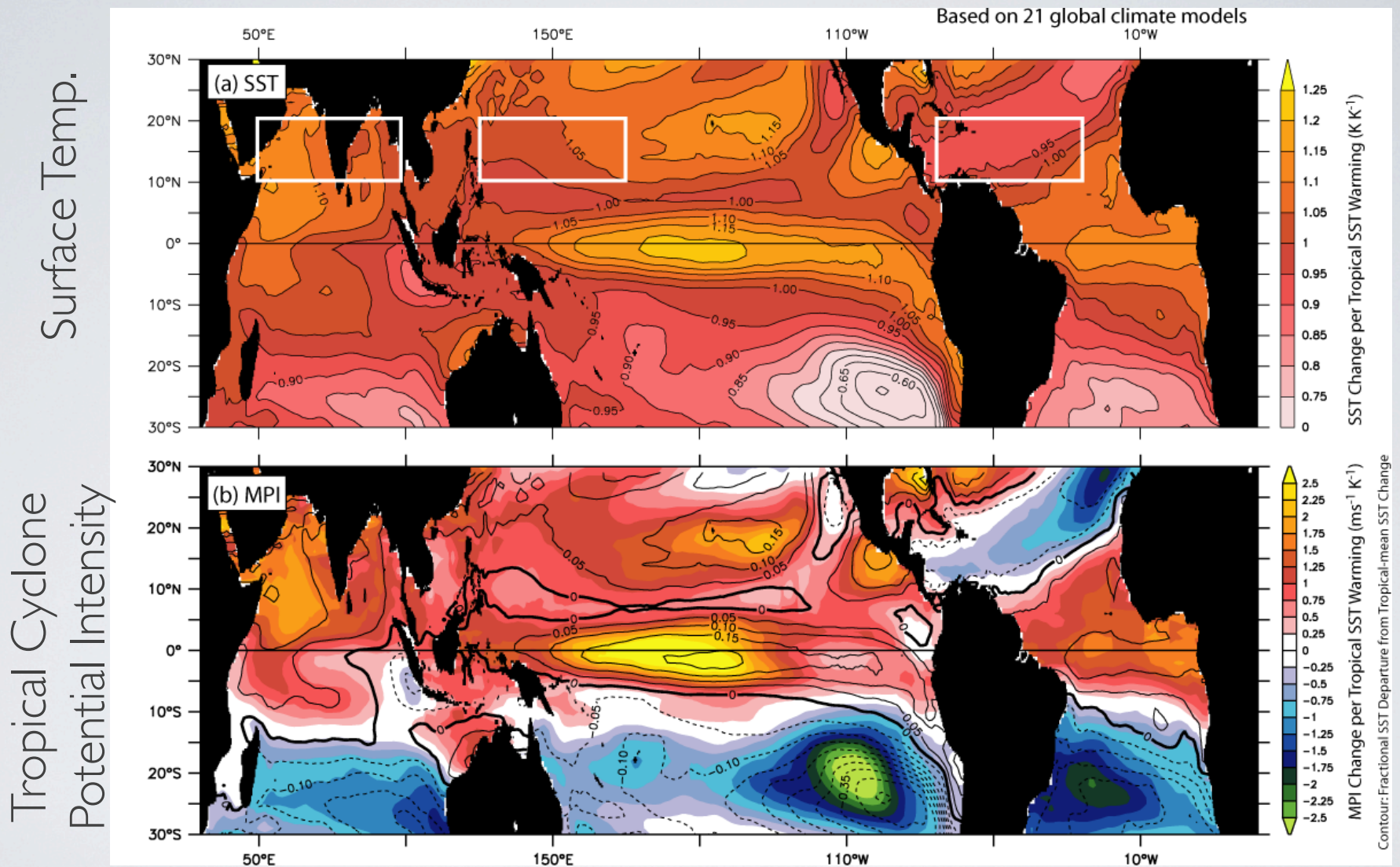
- ★ conserve momentum ($F = m \cdot a$)

- ★ account for changes in mass and composition

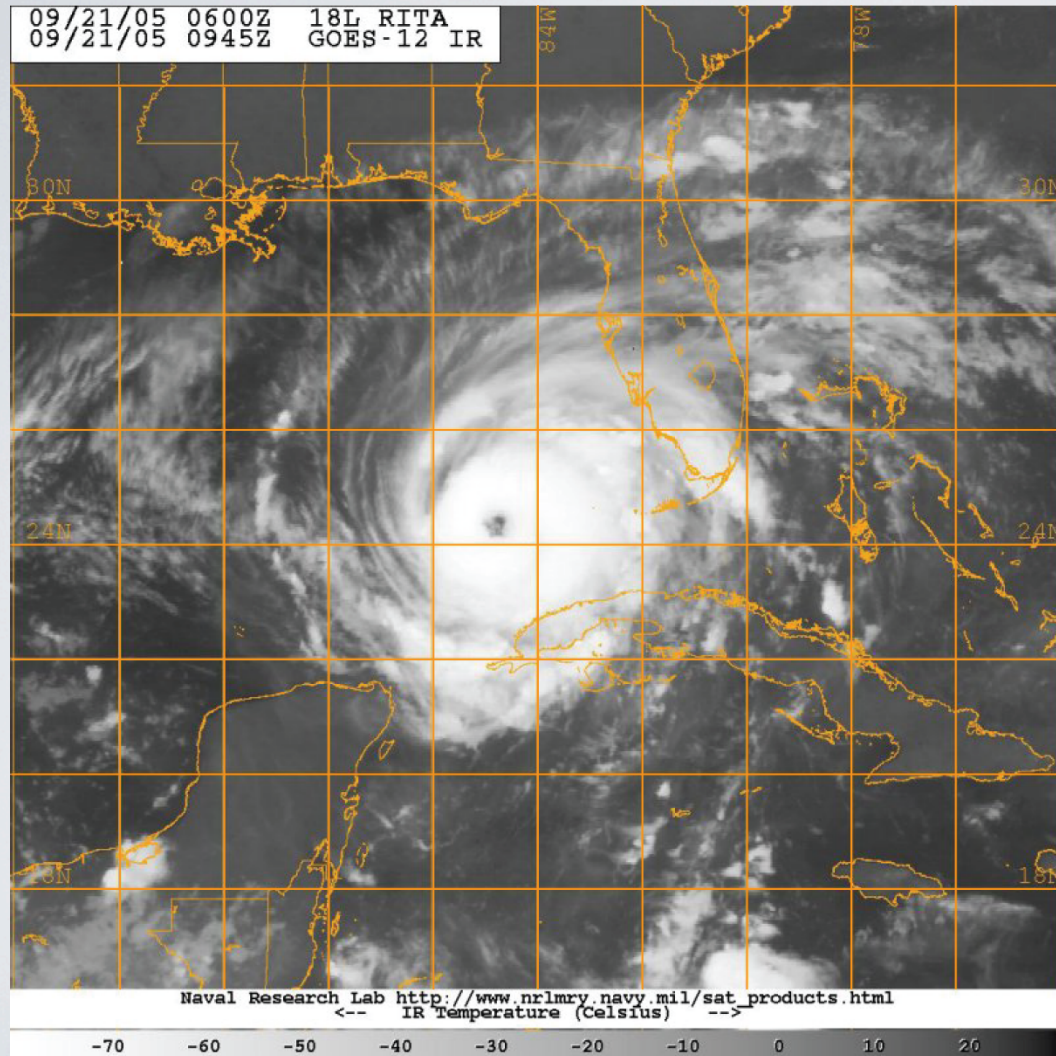
- ★ conserve energy (radiation, latent, etc...)

“Force” with solar radiation, structure of continents and atmospheric composition (e.g., CO_2)

GCM Projections of 21st Century Changes in Large-Scale Environment



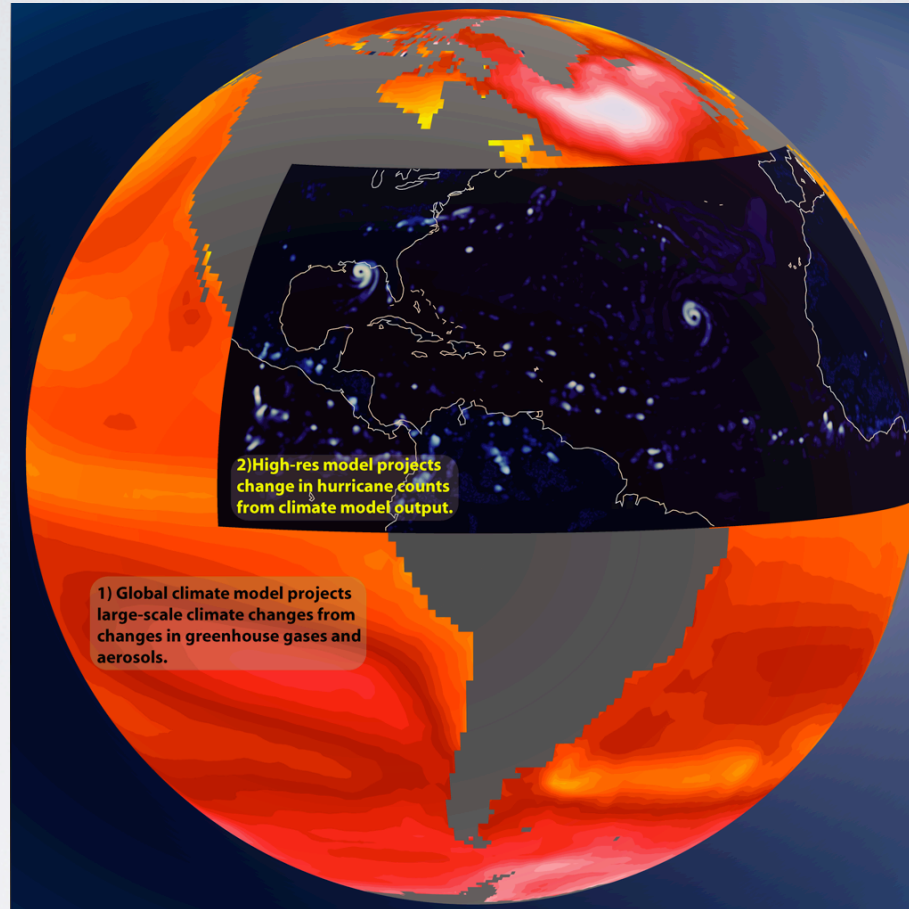
But, current computing power limits ability of coupled global climate models to represent hurricanes



Hurricane Rita (2005):
orange grid is
representative of most
current *coupled global*
climate model resolution.

Size of grid limited by
power of computers.

“Downscale” Climate Model Projections With High-Resolution or Statistical Models



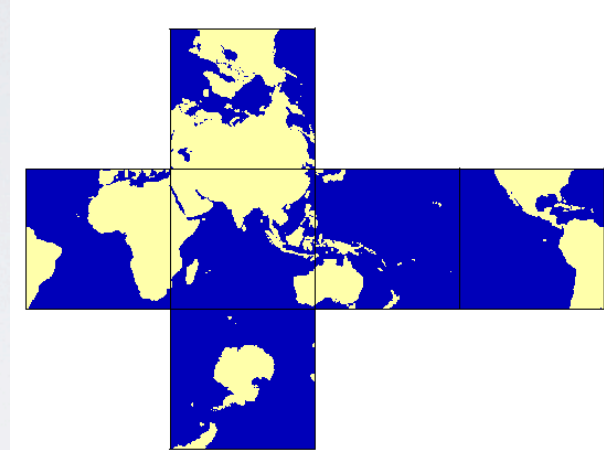
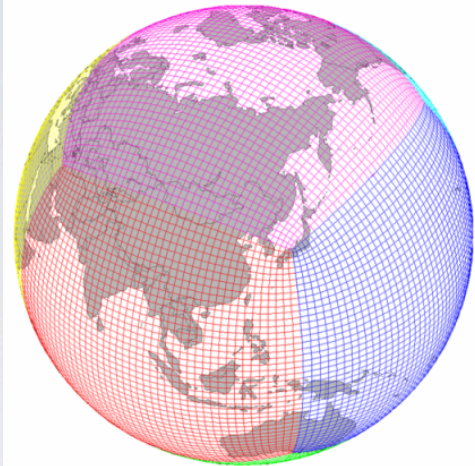
Global Climate Models -> High-resolution Model
Large-scale TS Frequency

Downscaling techniques for TC activity

- High-resolution global dynamical models (e.g., GFDL-HiRAM)
- High-resolution regional dynamical models (e.g., GFDL-ZETAC)
- Statistical models (e.g., $\text{Freq} = F(\text{SST}, \text{shear}, \dots)$)

The GFDL High-Resolution Atmosphere Model (HiRAM)

- Non-hydrostatic Finite-Volume dynamical core on the cubed-sphere

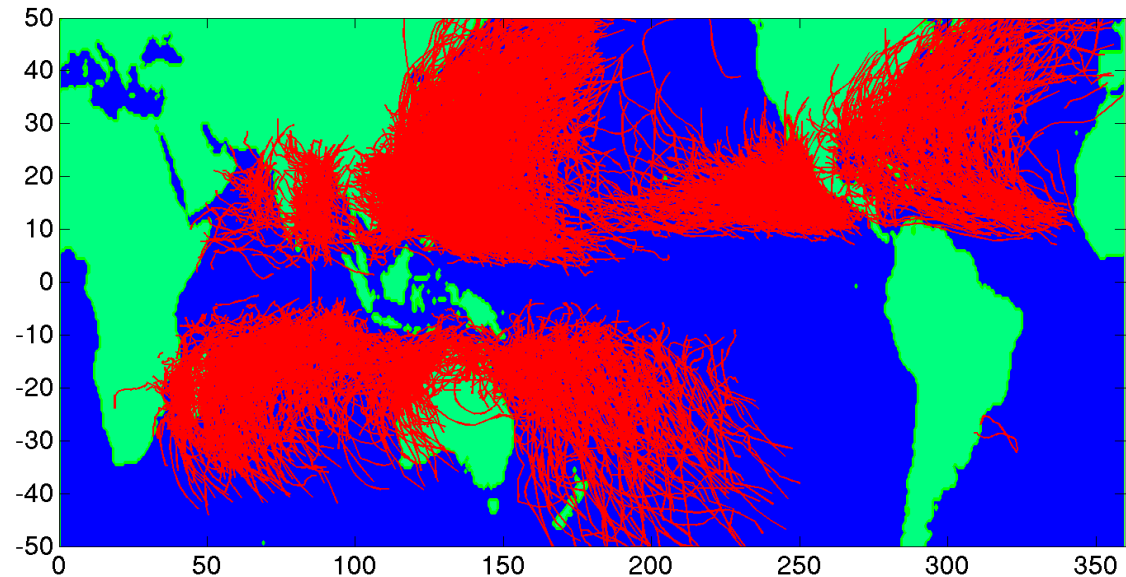


- Designed for resolution between 1– 100 km, capable of direct cloud simulation
- A PDF based 6-category cloud micro-physics with finite-volume vertical sub-grid reconstruction **allowing vertically & horizontally sub-grid cloud formation**
- A “non-intrusive” shallow convective parameterization (Bretherton scheme modified by Zhao *et al.* 2009)
- Options to couple with ocean and wave models

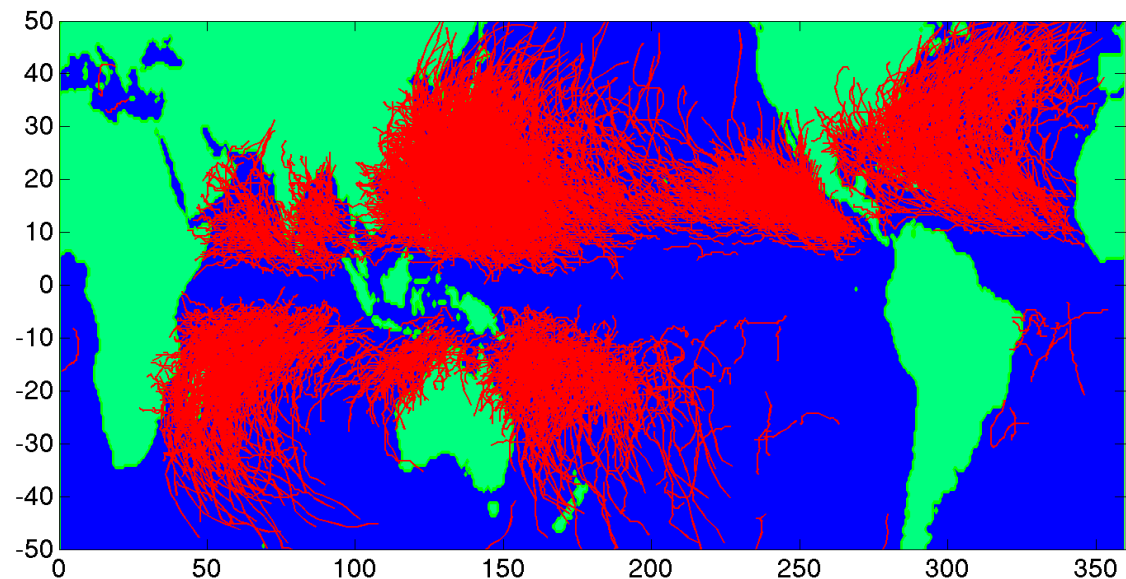
Slide: S-J Lin

Geographical distribution of TC tracks (1981-2009)

Observation

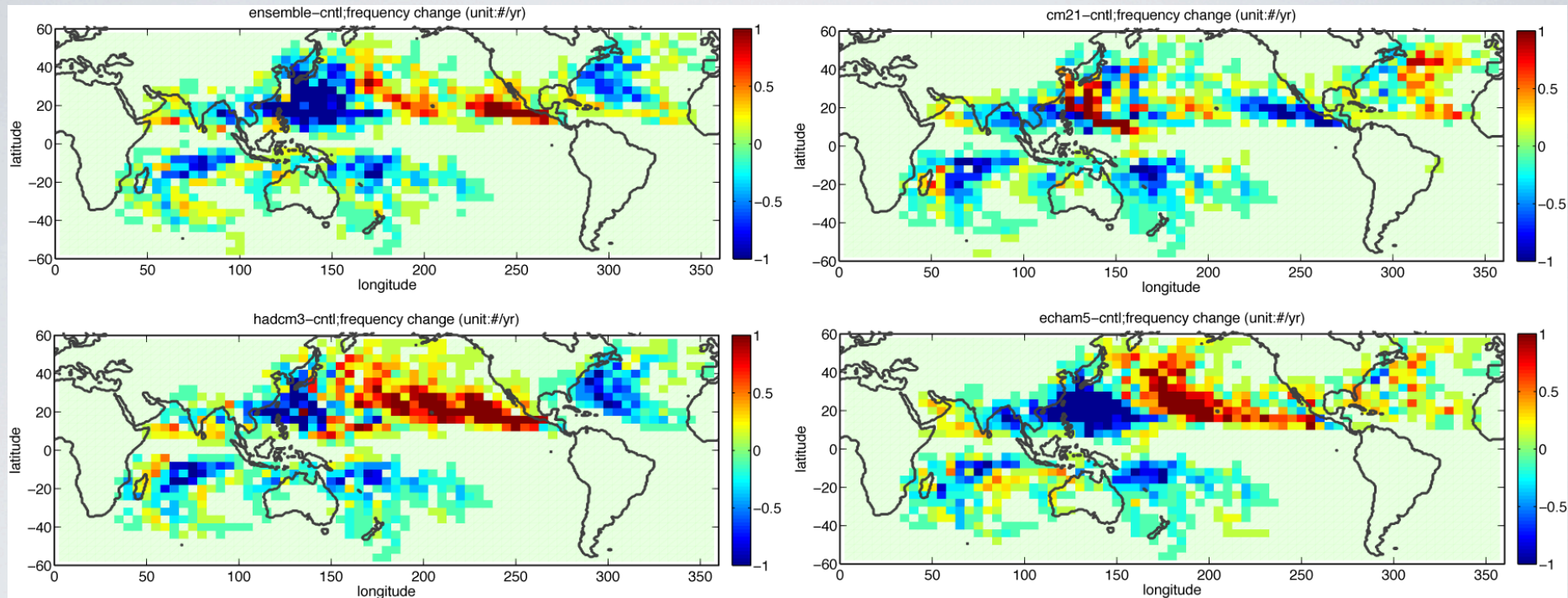


**HiRAM-C180
AMIP simulation**



Zhao et al. (2009)

Response of TC frequency in single 50km global atmospheric model forced by four climate projections for 21st century



Red/yellow = increase
Blue/green = decrease

Adapted from Zhao et al. (2009, J. Climate)

Regional increase/decrease much larger than global-mean.

Pattern depends on details of ocean temperature change.

Sensitivity of response seen in many studies

e.g., Emanuel et al. 2008, Knutson et al. 2008, Sugi et al. 2010, Villarini et al. 2011, Knutson et al. 2013, etc.

Use homogenized data and high-res models to build statistical models for exploration and projections

$$Rate = e^{a+bSST_{ATL}-cSST_{TRO}}$$

Family of statistical models based on observed and high-res. model hurricane activity and SST.

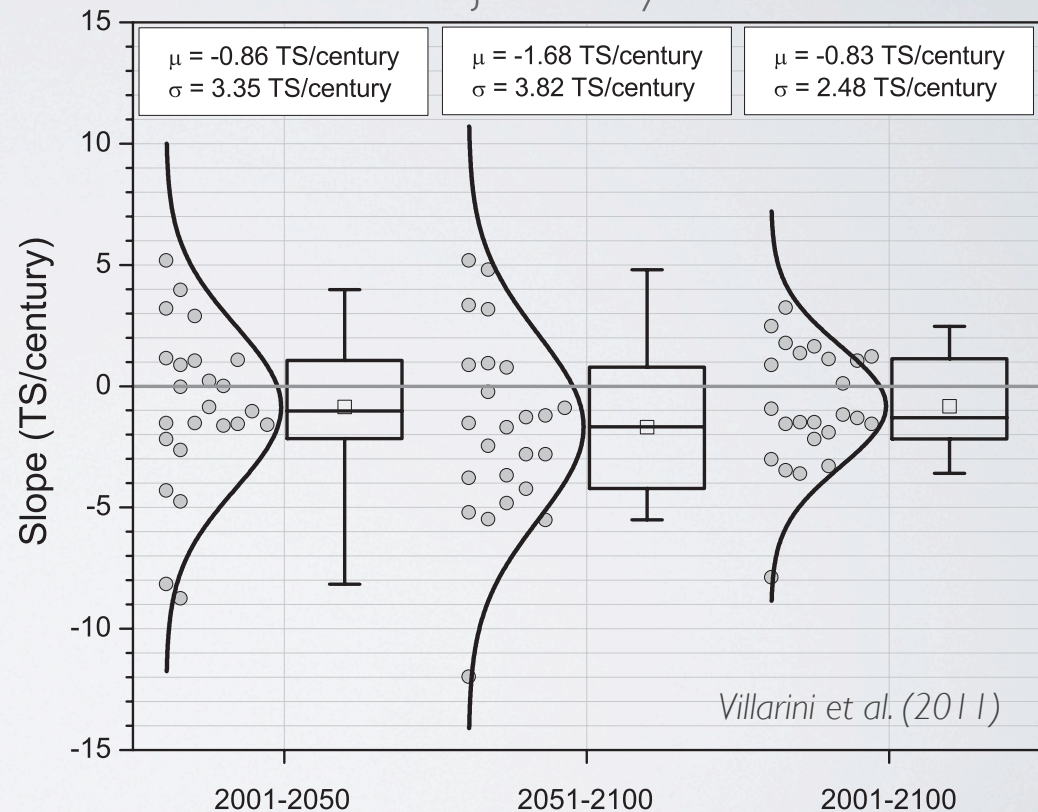
Use two predictors:

- Tropical Atlantic SST (positive)
- Tropical-mean SST (negative)

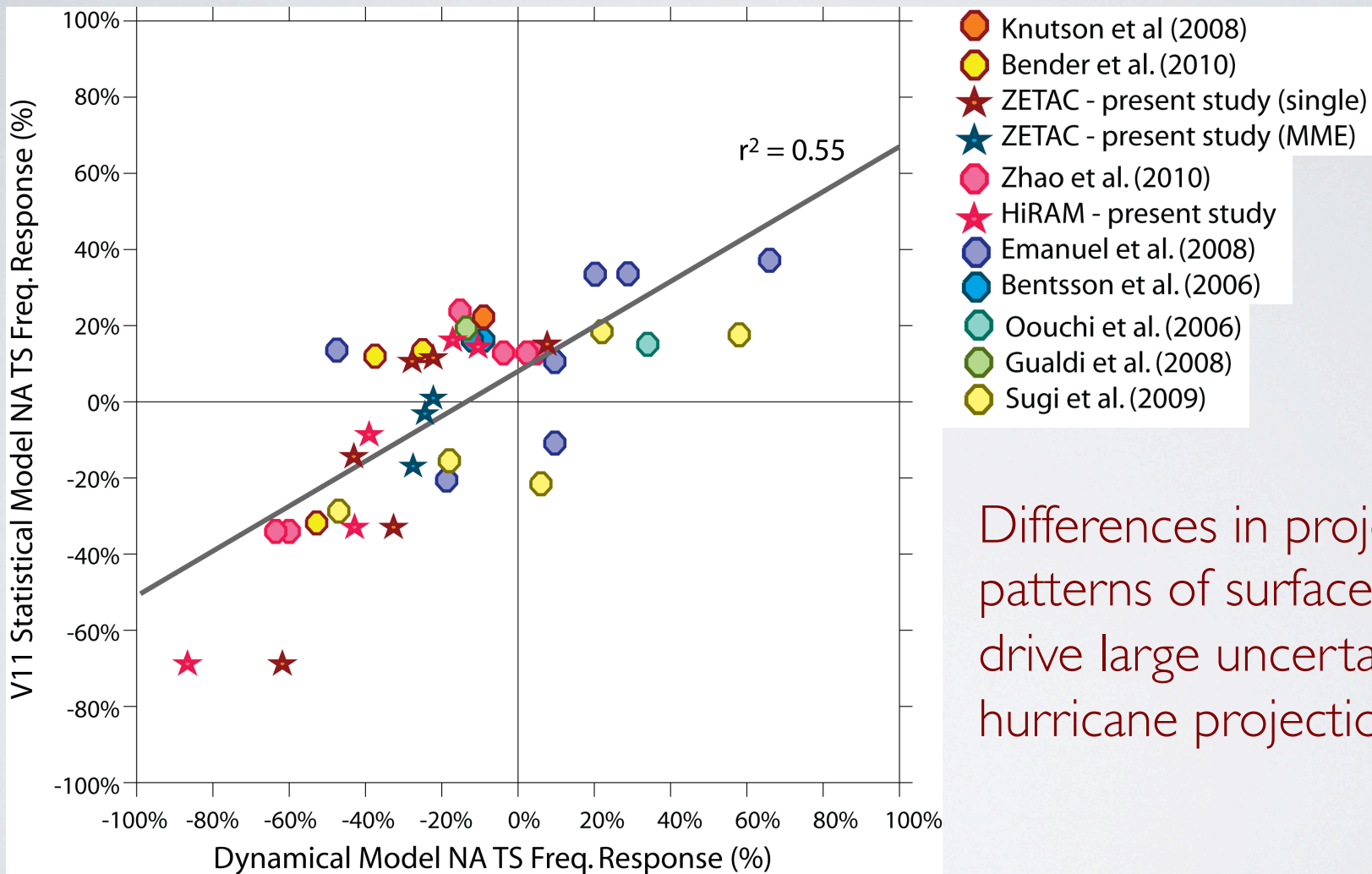
Consistent with high-res dynamical models, understanding on controls to hurricanes & “cheap”.

Knutson et al. (2008) Swanson (2008), Vecchi et al. (2008), Zhao et al. (2009, 2010), Villarini et al. (2010, 2011 a.,c), Villarini and Vecchi (2011)

Projections of North Atlantic TS Count Trends Using Observationally-based Statistical Model and SST Projected by 23 CGCMs



Simple statistical model explains much of the spread across many high-res modeling studies

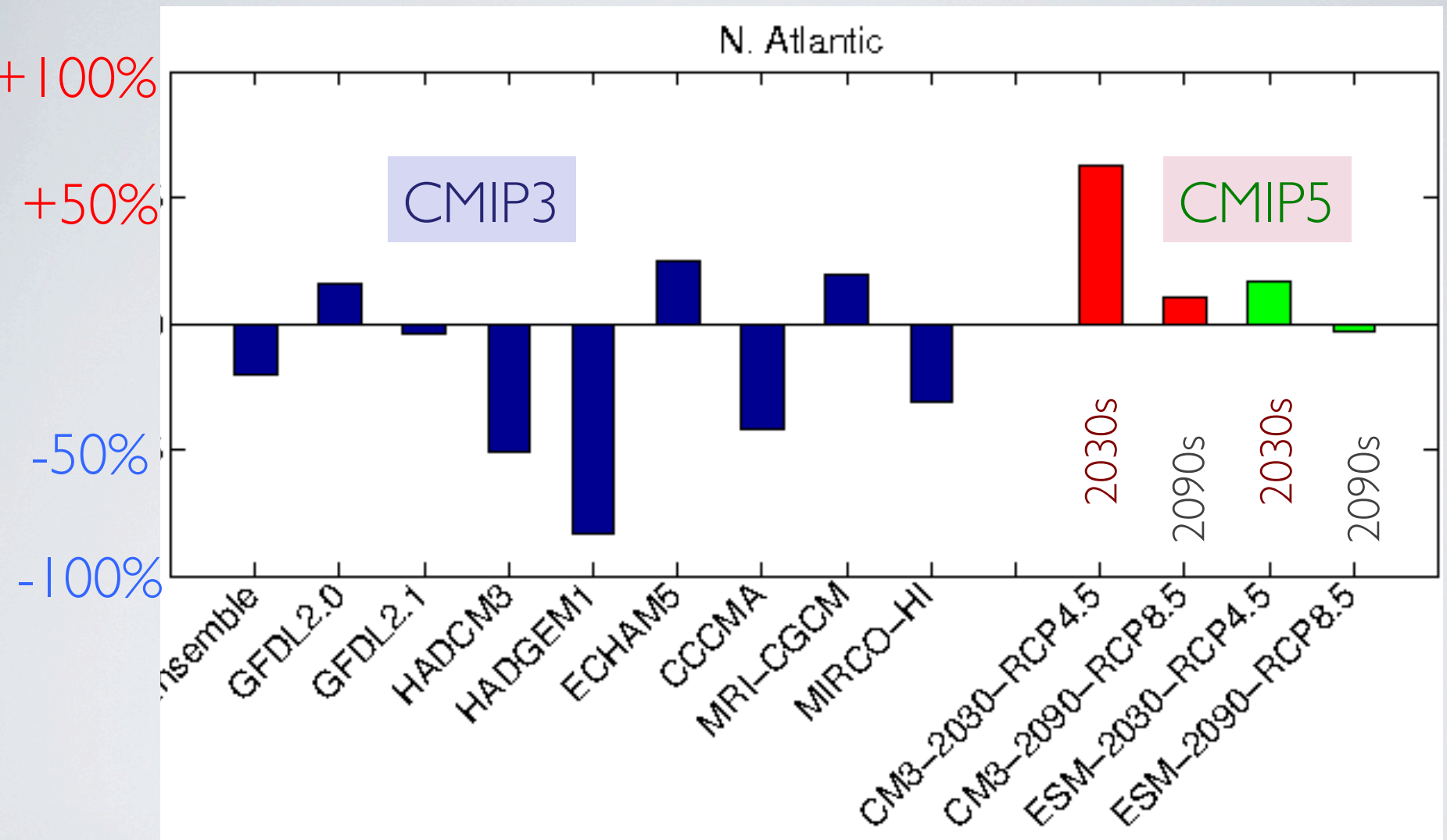


Differences in projected patterns of surface warming drive large uncertainties in hurricane projections

$$Rate = e^{a+bSST_{ATL}-cSST_{TRO}}$$

Knutson et al. (2013, J. Clim.)
See also Villarini et al. (2011, J. Clim.)
Vecchi et al. (2008, Science)

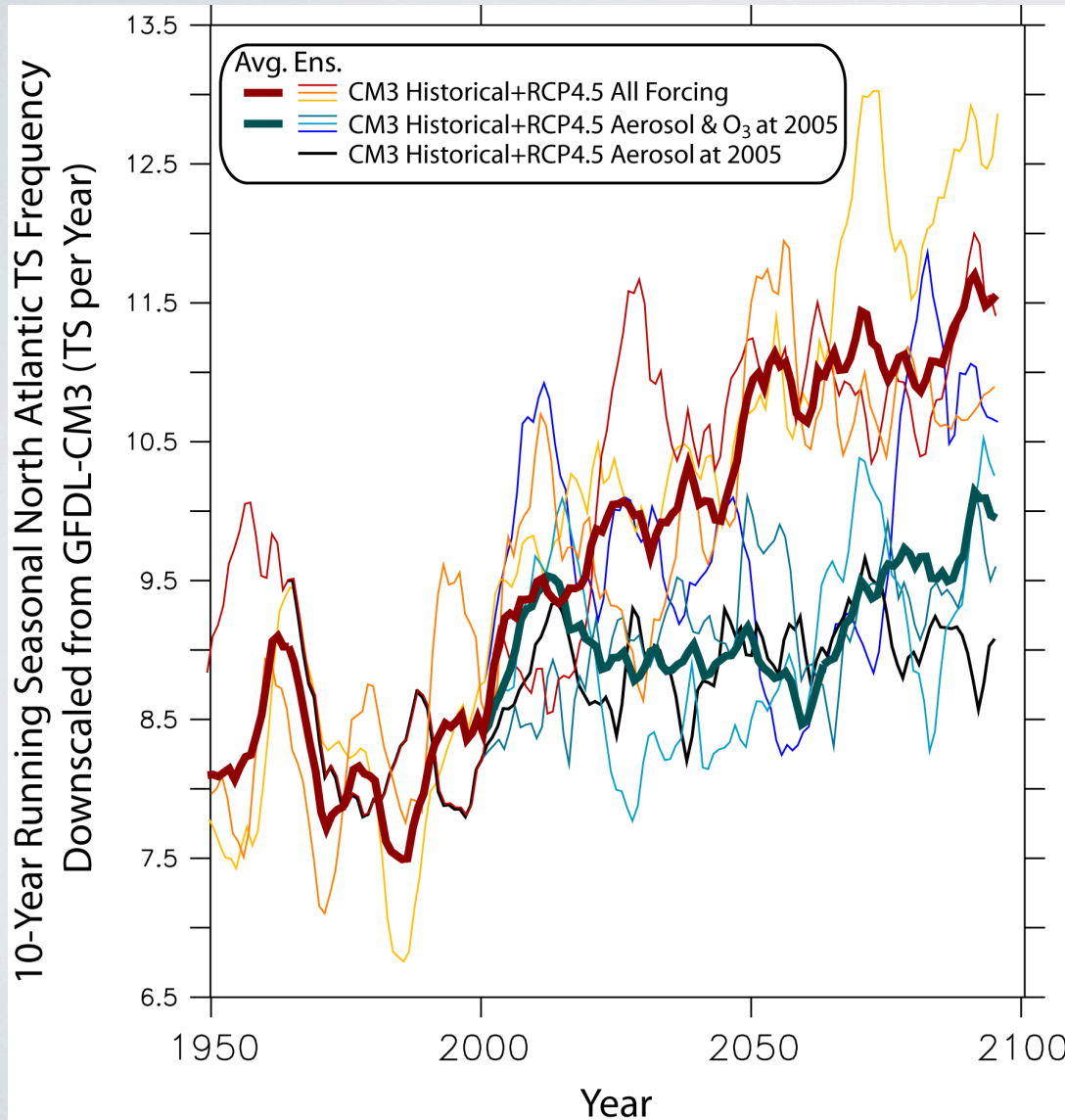
Dynamical Projections of Atl. Hurricanes for end of 21st Century



Using GFDL-HiRAM

Adapted from Zhao et al. (2009, J. Clim.) and Held et al. (2013, submitted)

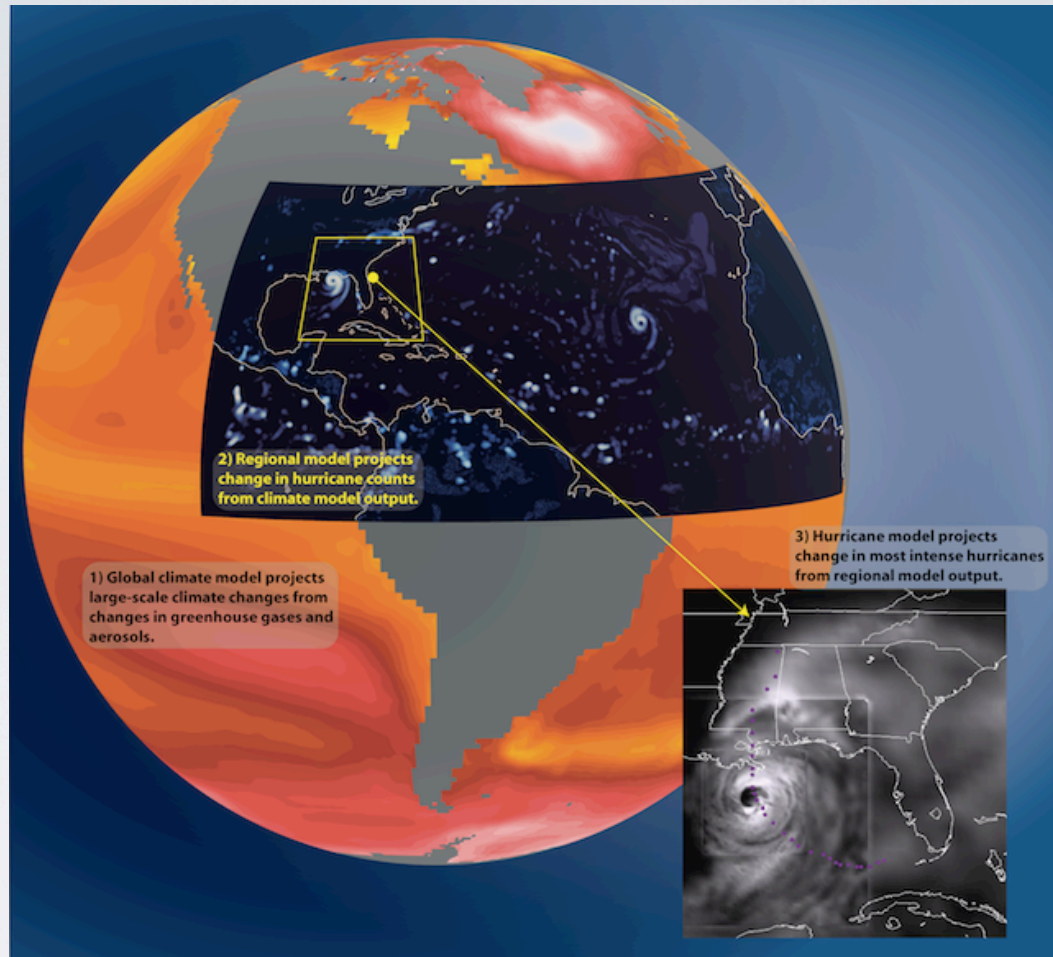
GFDL-CM3 indicates aerosols key for NA TS projections (projected aerosol clearing -> more storms)



All Forcing
No future aerosol or O₃
No future aerosol

Villarini and Vecchi (2012, Nature C.C.)

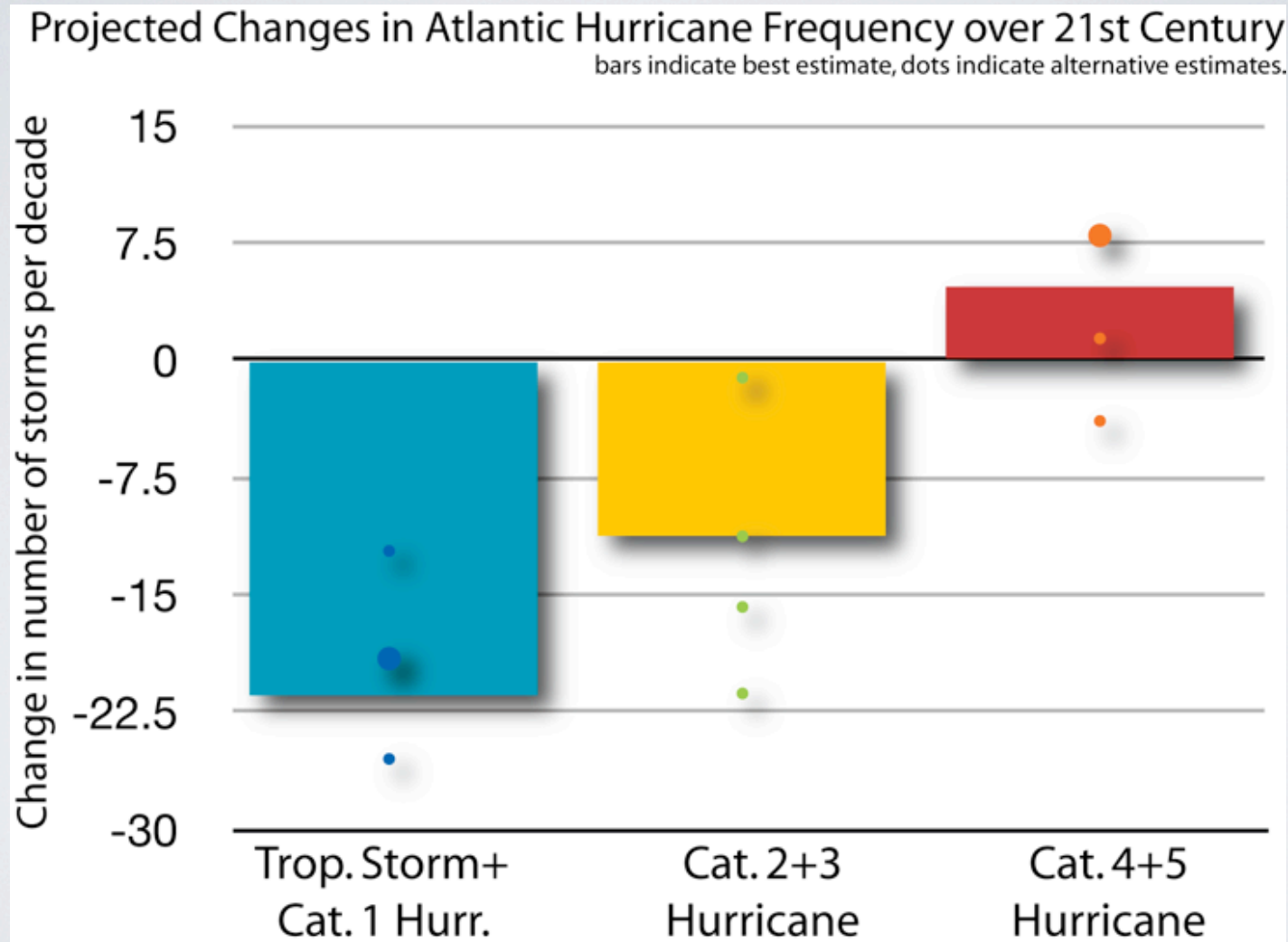
Multi-decadal projections



Global Climate Models -> High-Res Model -> Hurricane model

Large-scale TS Frequency Intensity

Dynamical double downscaling for Atlantic:
Overall frequency decrease projected,
but more of the strongest storms

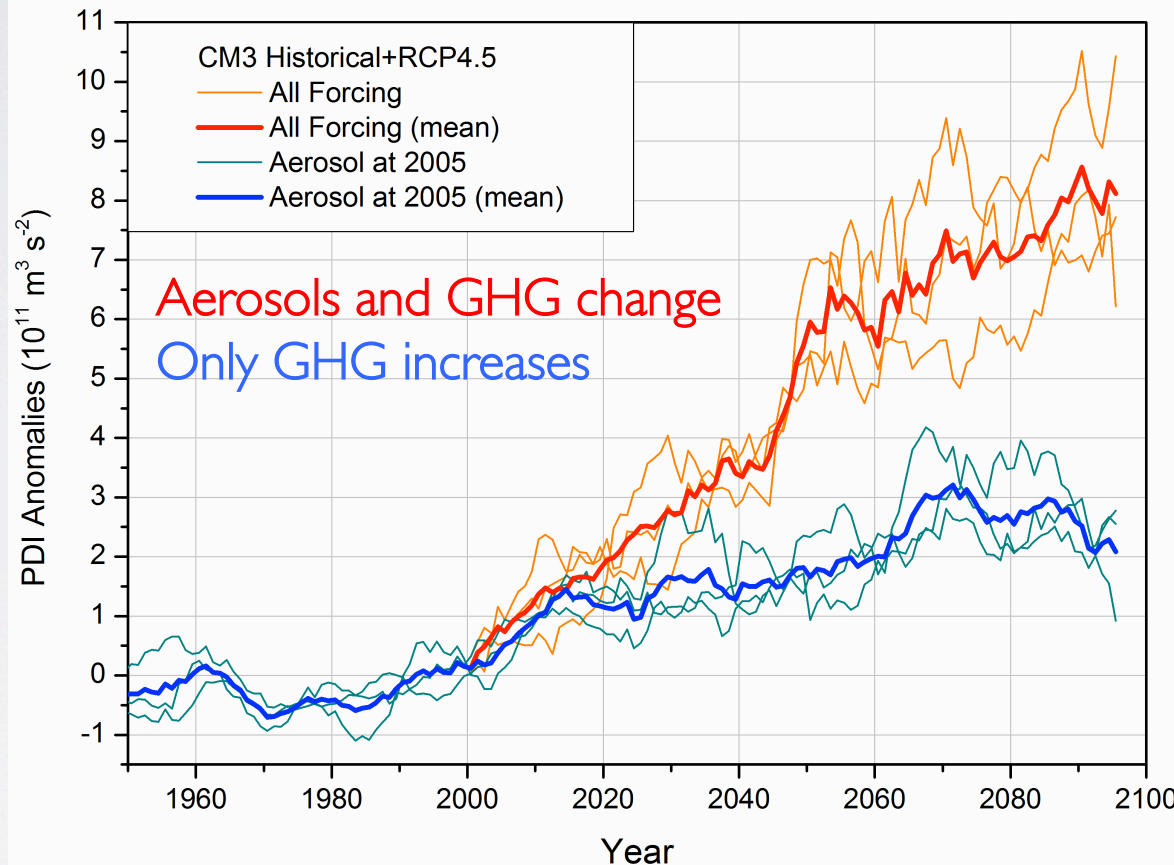


Adapted from Bender et al (2010, Science)
see also Knutson et al. (2008, Nature Geosci.); Knutson et al. (2013, J. Clim., in press)

Projections of reductions in atmospheric aerosols contribute to projected increases in Atlantic hurricane activity

Power Dissipation Index

$$PDI = \sum_{storms} U_{\max}^3$$



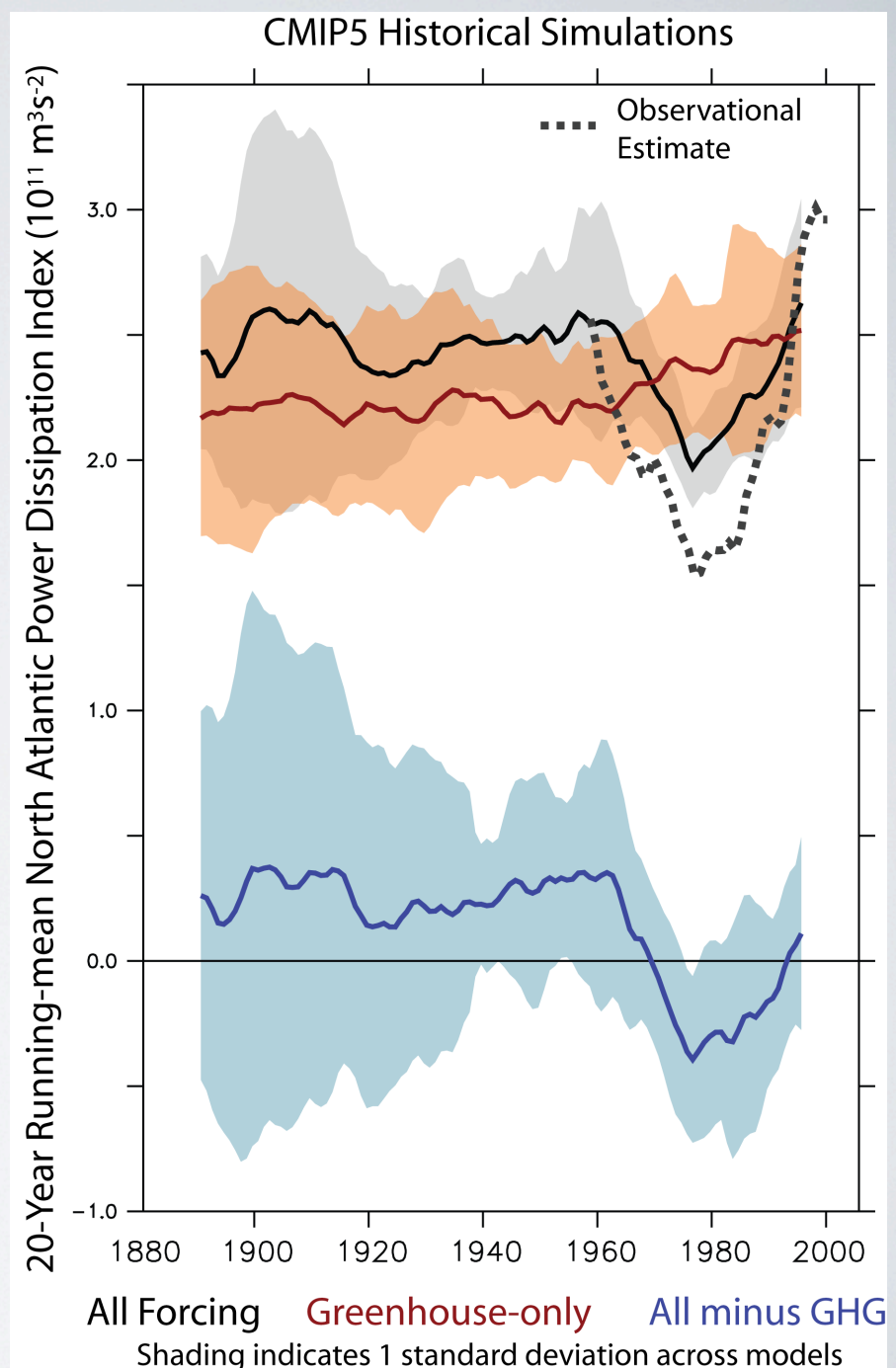
Villarini and Vecchi (2013, *J. Climate*)
See also Knutson et al. (2013, *J. Climate*)

Historical **aerosol forcing** may have masked century-scale **greenhouse-induced intensification** in Atlantic

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Villarini and Vecchi (2013, J. Climate)



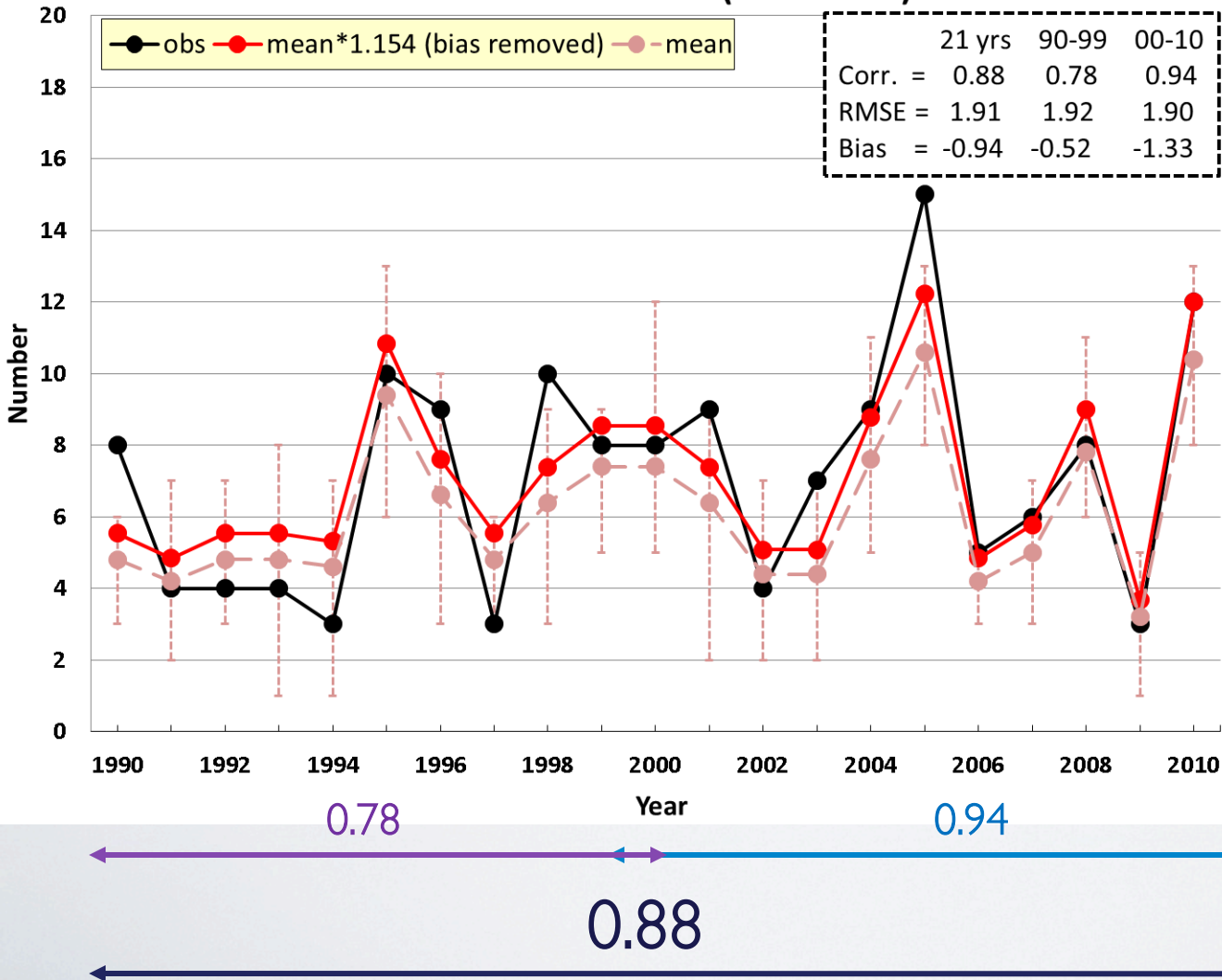
Seasonal Hurricane Prediction

- What can we say about the character of the upcoming hurricane season months or seasons in advance?

• 25km HiRAM Seasonal hurricane predictions – initialized July 1

• 1990-2010 (Jul-Nov)

North Atlantic Basin (Hurricanes)



Resolution: 25 km, 32 levels

- 5-members initialized on July 1 with NCEP analysis
- SST anomaly is held constant during the 5-month predictions
- Climatology O3 & greenhouse gases are used

1. Chen and Lin 2011, GRL

2. Chen *et al.*, submitted

Merge multiple tools and understanding to build experimental long-lead hurricane forecast system: skill from as early as October of year before

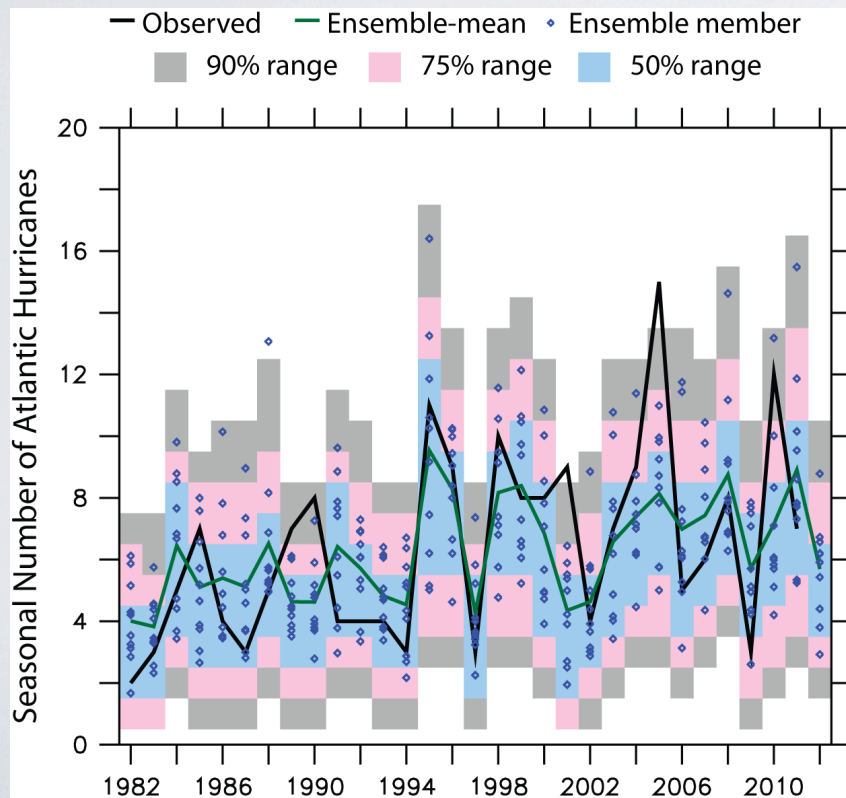
April & onward
forecasts fed to
NOAA Seasonal
Outlook Team

Hi-Res AGCM in
many different
climates.
Count storms.

Build statistical model
of the response of
hurricanes in HiRAM

Use initialized coupled
model to forecast
future values of SST

Initialized January: $r=0.66$



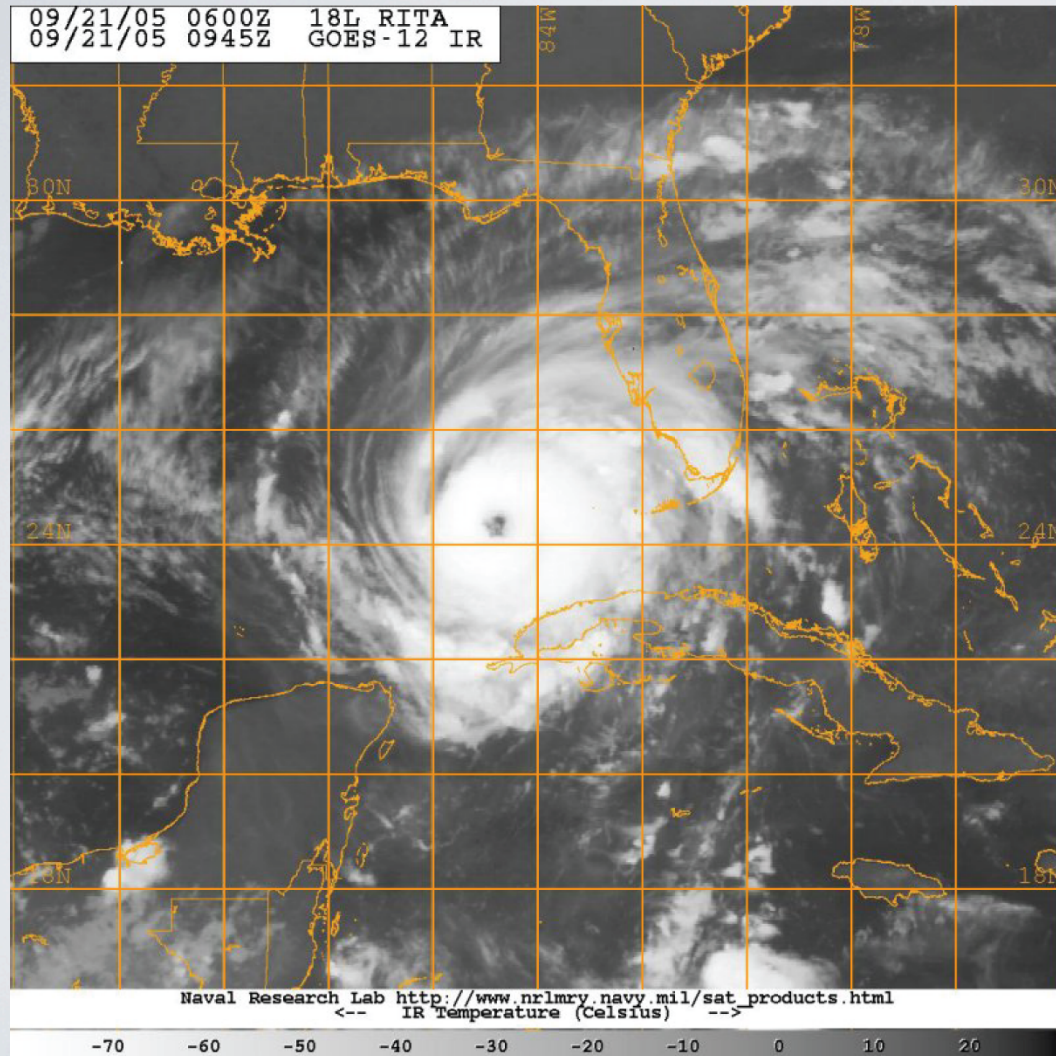
HyHuFS

Apply Stat
model to
Predicted
SST

Make Prediction
of Full PDF of
Hurricane Activity

<http://gfdl.noaa.gov/HyHuFS>

But, current computing power limits ability of coupled global climate models to represent hurricanes



Hurricane Rita (2005):
orange grid is
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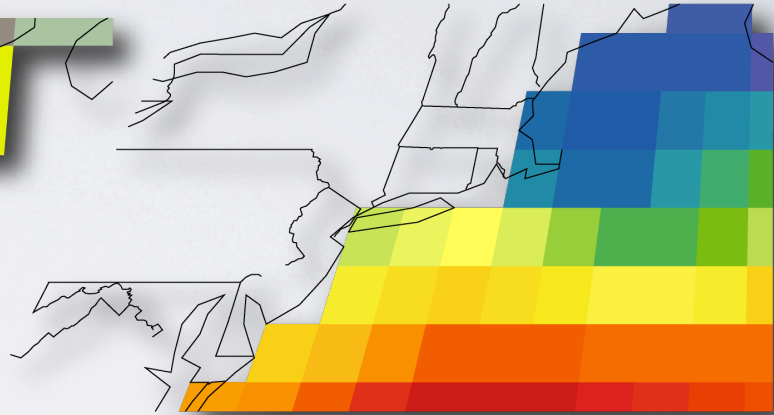
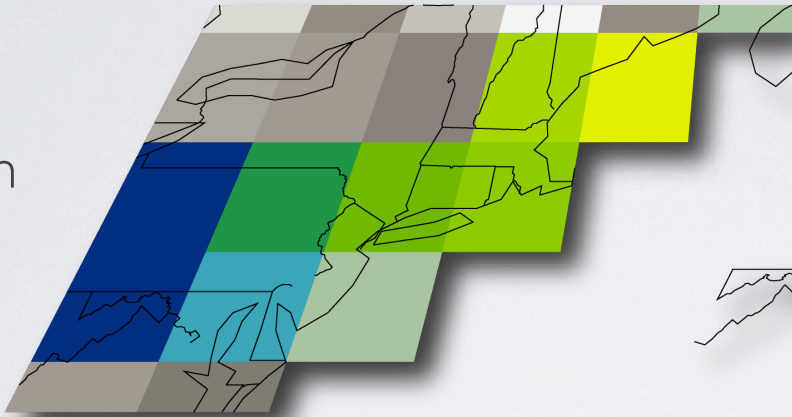
Size of grid limited by
power of computers.

Resolution (computer power, good models & hard work)
can help represent processes and phenomena

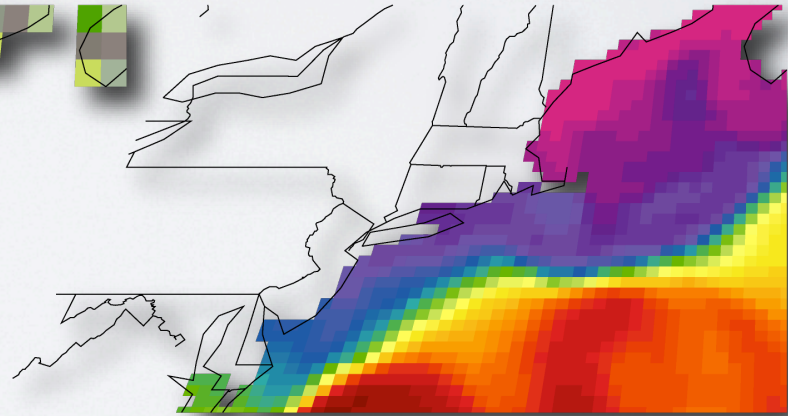
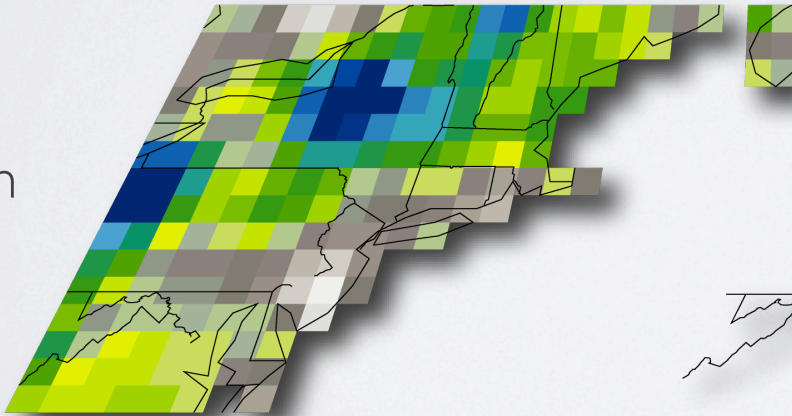
Precipitation

Ocean temp.

Medium
resolution
(CM2.1)



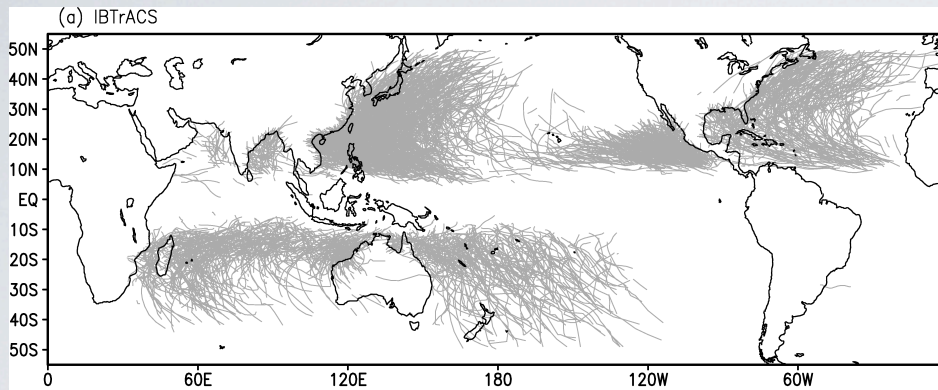
High
resolution
(CM2.5)



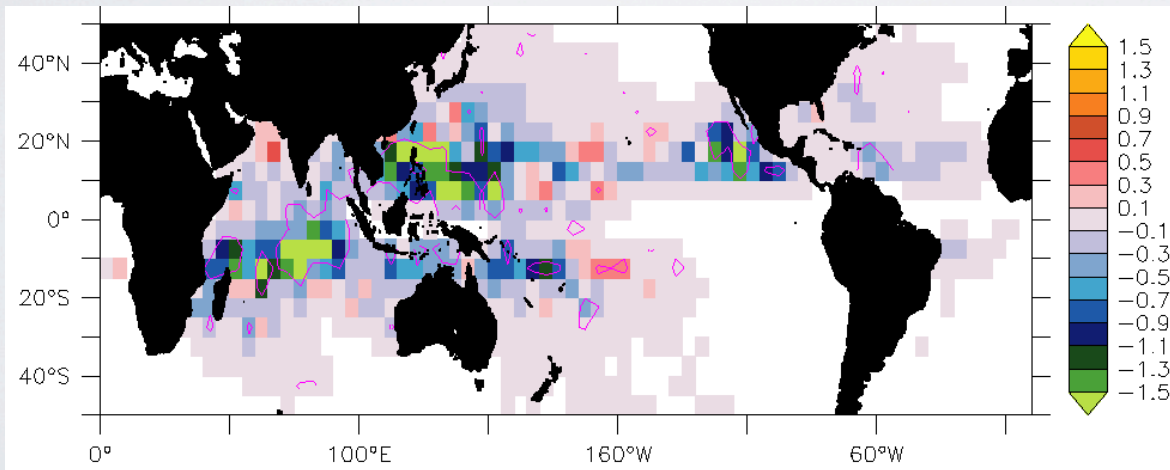
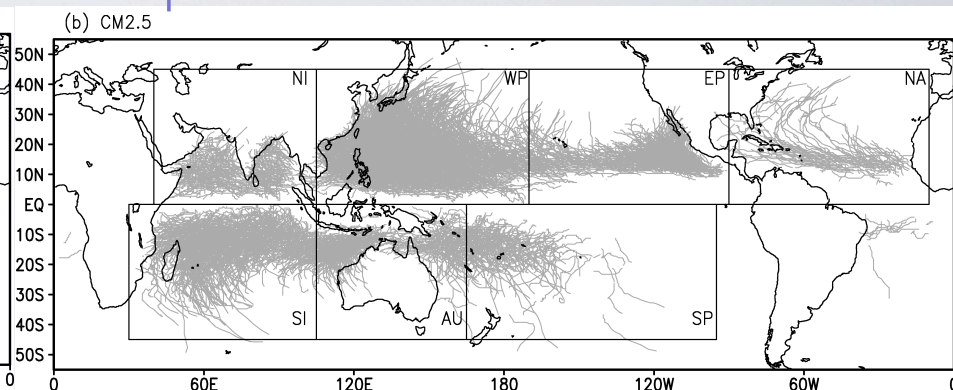
Adapted from Delworth et al. (2012, J. Clim.)

Response of TCs in high-resolution global coupled model (GFDL CM2.5, *Delworth et al. 2012, J. Climate; Kim et al. 2013 in prep.*)

Observed Tracks



Coupled Model Tracks

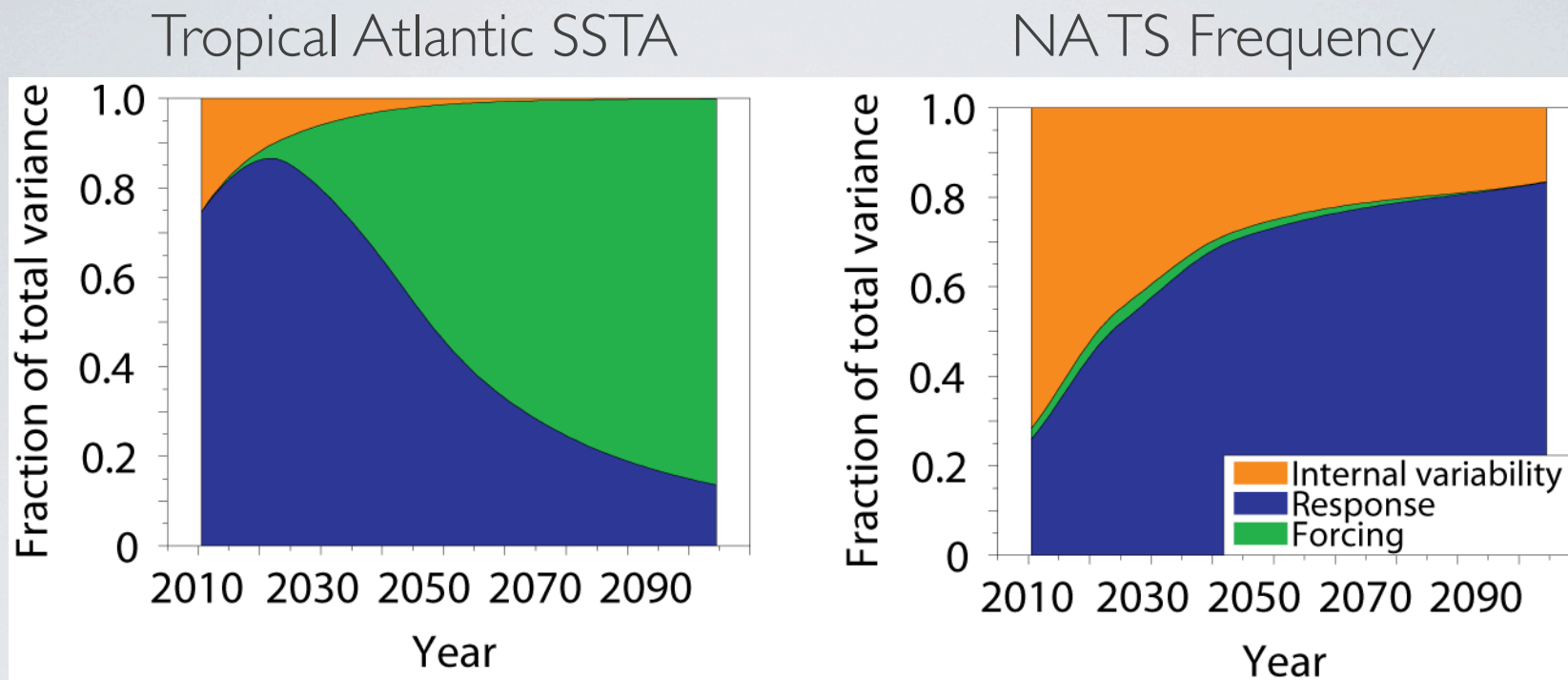


More storms

Fewer storms

CM2.5 Tropical storm density response to CO₂ doubling

Key uncertainty sources to projections of decadal TS activity



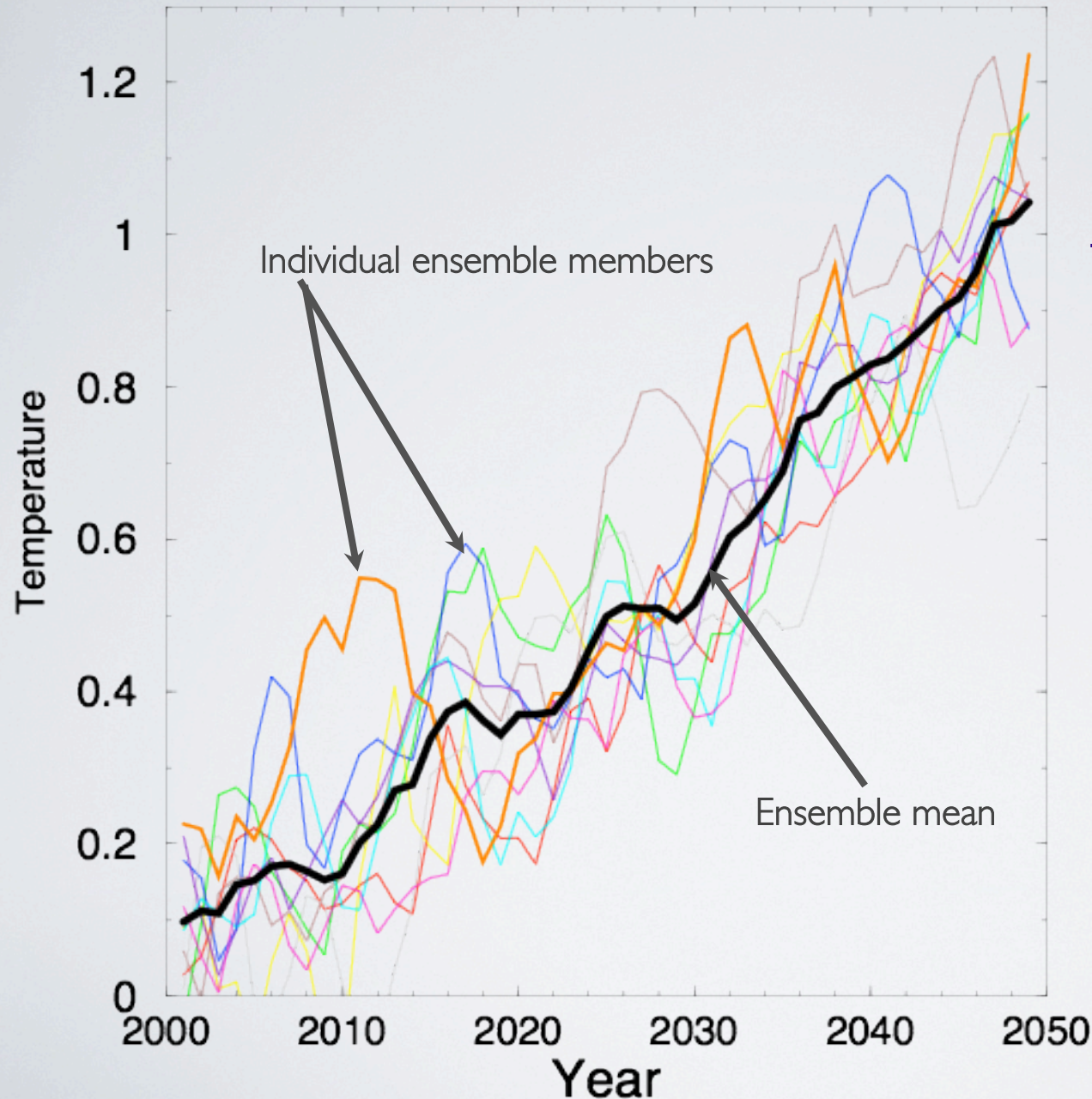
Villarini et al. (2011), Villarini and Vecchi (2012)

Sources of uncertainty (after Hawkins and Sutton, 2009)

- **Variability:** ~independent of radiative forcing changes
- **Response:** “how will climate respond to changing GHGs & Aerosols?”
- **Forcing:** “how will GHGs & Aerosols change in the future?”

Simulated Atlantic Sea Surface Temperature

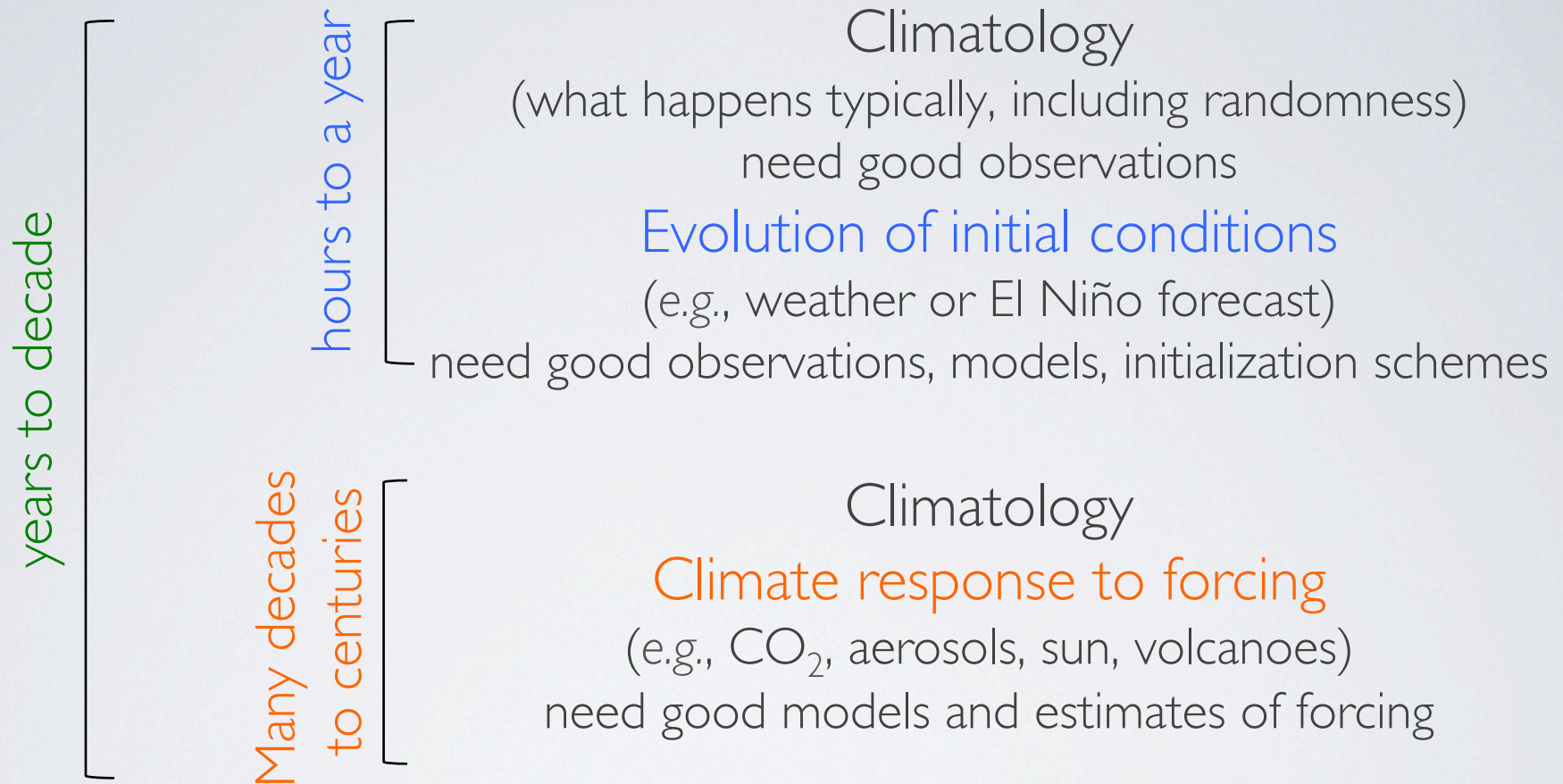
(based on GFDL CM2.1)



Can we predict the trajectory of Atlantic temperatures over the next several decades?

How about hurricane activity?

Sources of & Limitations on climate predictability

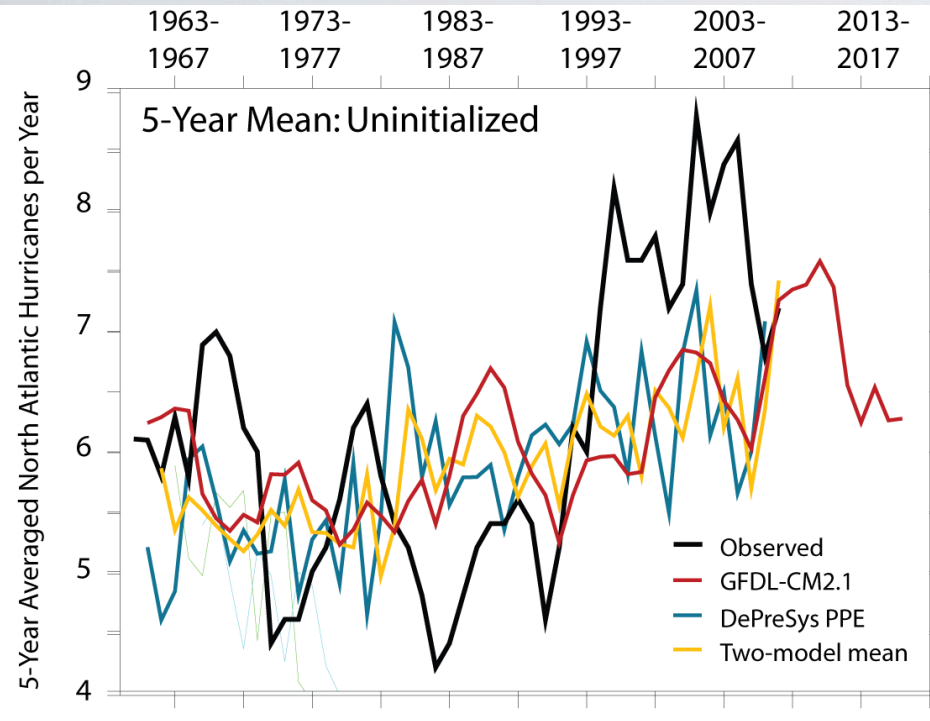


Decadal/multi-year prediction: New efforts focused mixed initial/boundary value problem

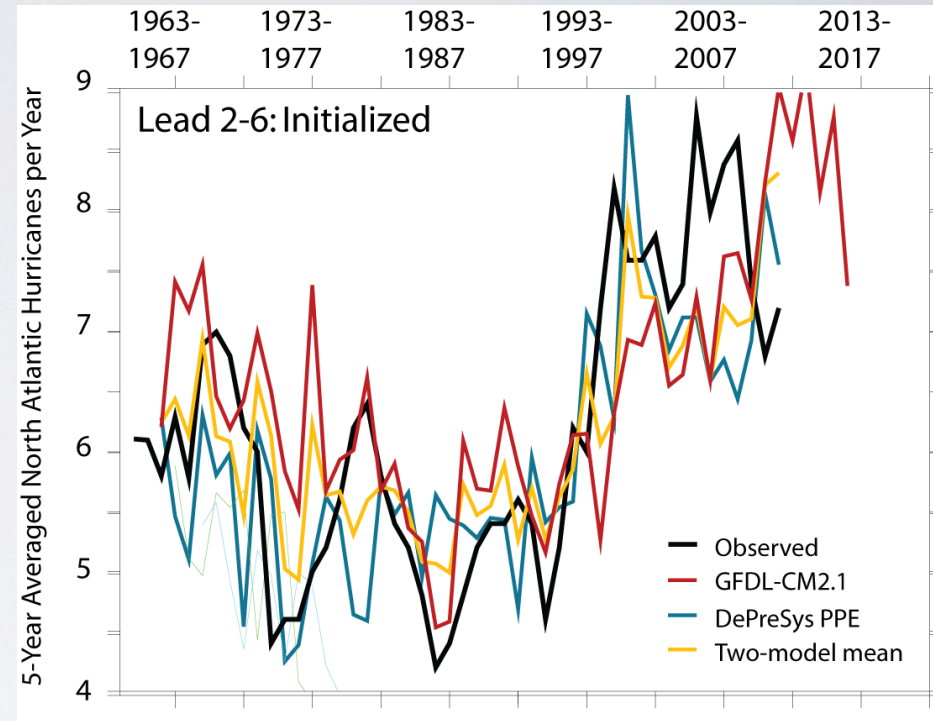
Experimental decadal predictions

Hybrid system: statistical hurricanes, dynamical decadal climate forecasts

FORCED



FORCED & INITIALIZED



- Retrospective predictions encouraging.
- However, small sample size limits confidence
- Skill arises more from recognizing 1994-1995 shift than actually predicting it.
- This is for basinwide North Atlantic Hurricane frequency only.

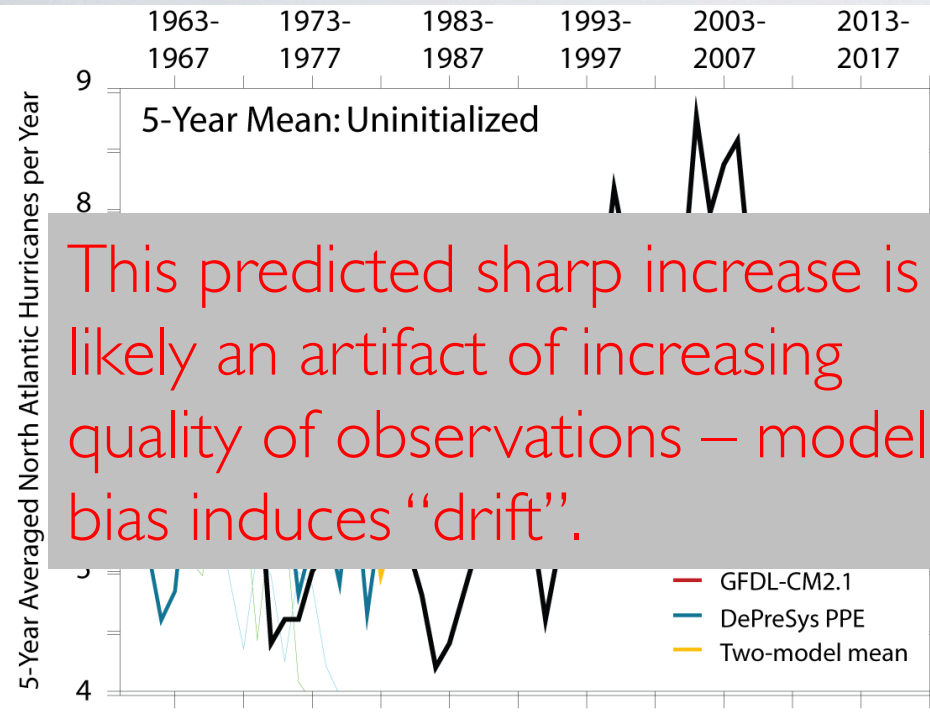
EXPERIMENTAL: NOT OFFICIAL FORECAST

Vecchi et al. (2013 in press), see also Smith et al. (2010, Science)

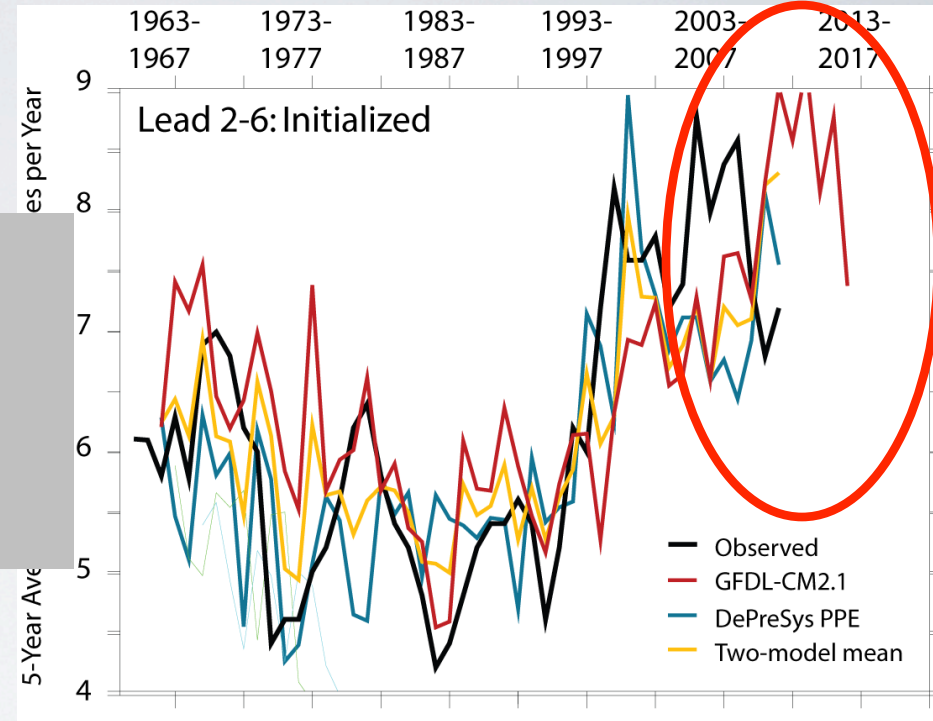
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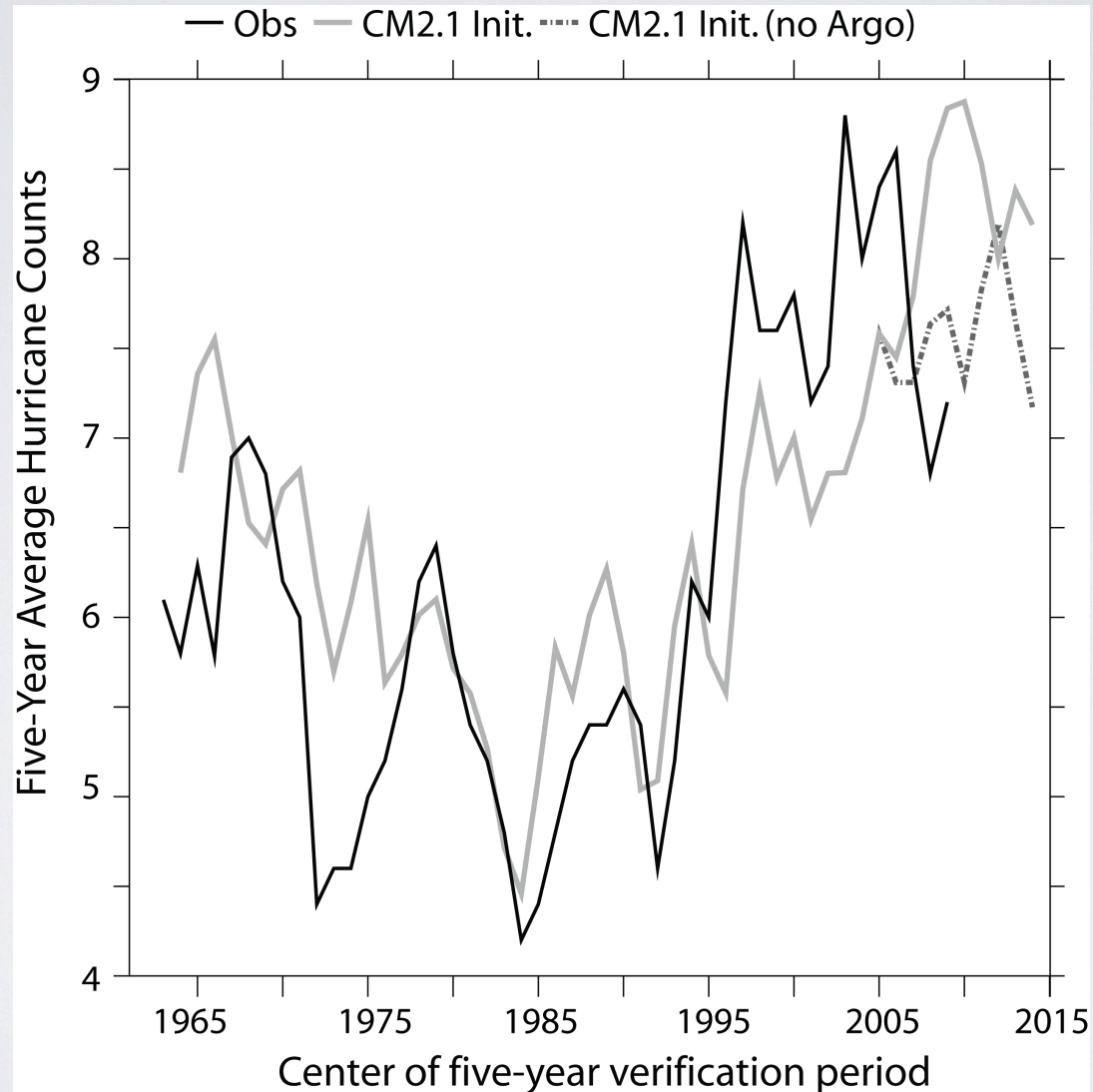


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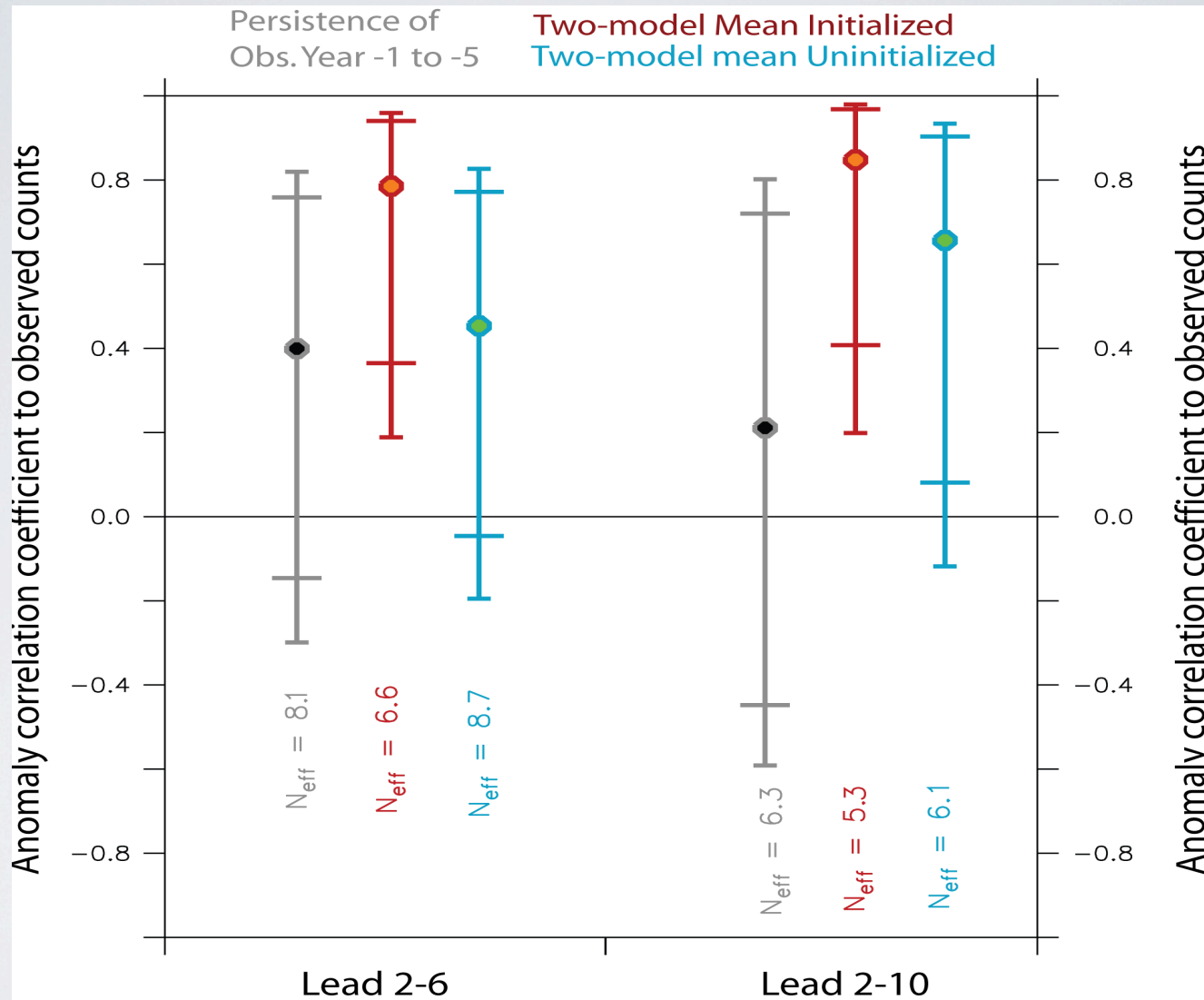
Vecchi et al. (2013 in press), see also Smith et al. (2010, Science)

Removing observational inhomogeneity removes post-2004 upswing:
need stable, sustained observations



Experimental decadal predictions

Hybrid system: statistical hurricanes, dynamical decadal climate forecasts



Summary

- Premature to conclude we have seen hurricane change due to CO₂
- Models allow estimates of future activity:
 - Next couple of decades: internal variability dominant player
(some may be predictable, some not)
 - NA Hurr. Response to CO₂: maybe fewer, probably stronger.
 - Aerosol forcing and response a key to next few decades.
- Encouraging results from long-lead (multi-season and multi-year) experimental forecasts using hybrid system:

*“past performance no guarantee of future returns”
but good past performance nice start...*
- High-resolution coupled and atmospheric models enable the next generation of hurricane prediction and projection.

References

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